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INTERNATIONAL APPLICATION PUBLISHED UNDER THE PATENT COOPERATION TREATY (PCT)

(51) International Patent Classification ⁶:

G06K 7/00

A2

(11) International Publication Number: WO 99/13427

(43) International Publication Date: 18 March 1999 (18.03.99)

(21) International Application Number: PCT/US98/19039

(22) International Filing Date: 11 September 1998 (11.09.98)

US

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12 September 1997 (12.09.97)

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(30) Priority Data:

08/928.851

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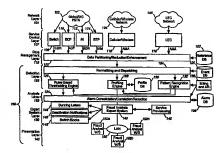
(81) Designated States: AL, AM, AT, AU, AZ, BA, BB, BG, BR,
BY CA CH CN CU CZ DE DK FF RS FI GR GF

(81) Designated States: AL, AM, AT, AU, AZ, BA, BB, BG, BR, BY, CA, CH, CN, CU, CZ, DE, DK, EE, ES, FI, GB, GB, GH, GM, HR, HIU, ID, IL, IS, JP, KE, KG, KP, KR, KZ, LC, LK, LR, LS, LT, LU, LV, MD, MG, MK, MN, MW, MX, NO, NZ, PL, PT, RO, RU, SD, SE, SG, SI, SK, SL, TI, TM, TR, TT, UA, UG, US, UZ, VN, YU, ZW, European patent (AT, BE, CH, CY, DE, DK, ES, FI, FR, GB, GR, IE, IT, LU, MC, NL, PT, SE).

Published

Without international search report and to be republished upon receipt of that report.

(54) Title: SYSTEM AND METHOD FOR DETECTING AND MANAGING FRAUD



(57) Abstract

A system, method and computer program product for processing event records. The present invention includes a detection layer, an analysis layer, an expert systems layer and a presentation layer. The layered system includes a core infrastructure and a configurable, domain-specific implementation. The detection layer employs one or more detection engines, such as, for example, a rules-based thresholding engine and a profiling engine. The detection layer can include an AI-based pattern recognition engine for analyzing data records, for detecting new and interesting patterns and for updating the detection engines to ensure that the detection engines can detect the new patterns. In one embodiment, the present invention is implemented as a telecommunications fraud detection system. When fraud is detected, the detection layer generates alarms which are sent to the analysis layer. The analysis layer filters and consolidates the alarms to generate fraud cases. The analysis layer preferably generates a probability of fraud for each fraud case. The expert systems layer receives fraud cases and automatically initiates actions for certain fraud cases. The presentation layer also receives fraud cases for presentation to human analysts. The presentation layer permits the human analysts to initiate additional actions.

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System and Method for Detecting and Managing Fraud

Cross-Reference to Related Applications

This patent application is related to the following commonly owned, copending U.S. utility patent application:

"Network Information Concentrator," Serial Number 08/426,256, Attorney Docket Number 1643/0012, incorporated herein by reference.

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Background of the Invention

Field of the Invention

example, telecommunications network event records. The present invention relates to processing event records, such as, for

Related Art

as service providers implement new systems to detect current methods of fraud, have experienced difficulty in keeping up with new methods of fraud. As soon estimated to have cost \$3 billion in 1995. Telecommunications service providers fraud also grows. criminals innovate new methods. As the telecommunications industry rapidly grows, telecommunications In the United States alone, telecommunication fraud is

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dial 1+, 800 inbound, and cellular calls. In addition, international dialing is a customer premise equipment (CPE), including private branch exchanges (PBX), pays, is also a frequent target of fraud. where a customer subscribes to a service, such as 800 or Dial 1, and then never frequent target of fraud because of its high price of service. Subscription fraud. services and corresponding fraud include use of calling cards, credit cards, Current methods of fraud are targeted at all types of services.

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number of calls more than 1 hour in duration, calls to specific telephone numbers, Many parameters can be used to tailor a particular thresholding system for certain calls to specific countries, calls originating from specific telephone numbers, etc number of calls in a day, number of calls less than one minute in duration. threshold has been exceeded. Parameters for such thresholds include total predetermined thresholds and then monitoring service records to detect when a customers or services. Existing methods of detecting fraud are based primarily on setting

easy for criminals to detect and circumvent. Also, since such thresholds must be are static and thus do not adjust to changing patterns of fraud. They are therefore directly based upon empirical data. In addition, manually programmed thresholds and time consuming. Moreover, these thresholds are generally subjective and not These thresholds must be manually programmed, which is labor intensive

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non-fraudulent calls, contributing to high rates of false alarms set conservatively in order to detect most fraud, they are frequently exceeded by

correlating is time consuming, labor intensive, highly subjective and prone to fraud is spanning across services. also assess several different alarms and correlate them to determine if a case of and service provisioning data, to assess the probability of fraud. The analyst must The analyst must query many sources of data, such as customer payment history analyst, who must then analyze the alarm to determine if it properly reflects fraud. When a threshold is exceeded, an alarm is triggered and presented to an This manual process of analyzing and

a calling card or blocking an ANI (Automatic Number Identifier) from originating an appropriate action and then initiate it. Such actions can include deactivating When it is determined that fraud has occurred, the analyst must then select

routines, and thresholds must constantly be re-programmed. configurable for other service providers or industries, new rules, algorithms, Because current systems of fraud management are rigid and generally not

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telecommunications fraud, credit card and debit card fraud, data mining, etc. and that can be implemented in a variety of applications such as, for example, product for detecting and automatically acting upon new and evolving patterns What is needed is a configurable system, method and computer program

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Summary of the Invention

detecting certain types of activity, such as, for example, thresholds and profiles, for processing event records. The present invention includes a detection layer for for generating alarms therefrom and for analyzing event records for new patterns. The present invention is a system, method and computer program product

human operator to initiate additional actions. presentation layer for presenting cases to human operators and for permitting cases, an expert systems layer for automatically acting upon certain cases and a The present invention also includes an analysis layer for consolidating alarms into

provides configurability to the system. The domain-specific implementation is provided with user specific data and thus is generically employed regardless of the actual type of network being monitored. user-specific, or domain-specific, implementation rules. The core infrastructure The present invention combines a core infrastructure with configurable,

processing engines. oriented databases, relational database, etc. User-configurable data can include include one or more databases including, for example, flat files databases, object database for storing domain-specific data. The user-configurable database can which fields of normalized network event records are to be sent to different conversion formats for normalizing records and dispatch data for specifying The domain-specific implementation can include a user-configurable

fraudulent use of the telecommunications network. In another embodiment, the data mining system or a market analysis system. present invention is implemented in a credit card and/or debit card fraud detection network event records from a telecommunications network and detects possible telecommunications fraud detection system in which the detection layer receives In one embodiment, the present invention is implemented In yet another embodiment, the present invention is implemented in a

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include a core infrastructure and a configurable, domain-specific implementation specific embodiment employed. The normalizing and dispatching functions to one or more processing engines in the detection layer, depending upon the event records prior to acting upon them. Normalized event records are dispatched come from a variety of sources. Thus, event records are preferably normalized Regardless of the implementation-specific embodiment, event records can

example, bill paying history data for a particular caller. telecommunications fraud detection system, enhancement data can include, for additional information related to a network event record. to acting upon them. Enhancement can include accessing external databases for for example, a thresholding engine, a profiling engine and a pattern recognition The detection layer can employ a plurality of detection engines, such as, One or more of the detection engines can enhance event records prior For example, in a

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post-call data. thresholding can be based on pre-completion call data, as well as conventional an alarm is generated. In a telecommunications fraud detection implementation, determine when thresholds have been exceeded. When a threshold is exceeded, A thresholding engine constantly monitors normalized event records to

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to the configurable domain-specific implementation. network event records. The underlying core infrastructure provides scalability employ complex thresholding rules that compare and aggregate various data and engine. Thus, the domain-specific implementation of the thresholding engine can automatically updated, preferably with updates generated by a pattern recognition thresholding rules. detection algorithms. The domain-specific implementation includes user-specific domain-specific implementation. The core infrastructure includes configurable The thresholding engine includes a core infrastructure and a configurable, The rules can be easily tailored for specific uses and can be

pre-completion call data, as well as conventional post-call data. telecommunications fraud detection implementation, profiling can be based on departure from a profile is detected, a corresponding alarm is generated. In a determine when a departure from a standard profile has occurred. A profiling engine constantly monitors normalized event records to

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user-specific profiles. The profiles can be easily tailored for specific uses and can domain-specific implementation. The domain-specific implementation provides The profiling engine includes a core infrastructure and a configurable,

configurable domain-specific implementation. recognition engine. be automatically updated, preferably with updates that are generated by a pattern The core infrastructure provides scalability to the

and a profile database for profile analysis. patterns to dynamically update both a rules database for parametric thresholding the telecommunications network. The pattern recognition engine uses the new interesting or unusual patterns can indicate fraudulent or non-fraudulent use of patterns develop. monitor event records and to determine whether any interesting or unusual A pattern recognition engine preferably employs artificial intelligence to In a telecommunications fraud detection implementation,

domain-specific implementation. database are developed from actual use of the system and are, thus, part of the an Al pattern analysis processor for analyzing records and a call history database configurable, domain-specific implementation. The core infrastructure includes for storing a history of prior records. The actual contents of the call history The pattern recognition engine includes a core infrastructure and a

calculated for each alarm. a telecommunications fraud detection implementation, a probability of fraud is calling patterns. Varying departures from these profiles will trigger an alarm. In engine, which can then establish profiles that represent normal and fraudulent can be adjusted in accordance with changing patterns of fraud. Patterns and from external sources. In addition, pattern recognition data is fed to the profiling thresholds are based on real-time event data, as well as historical data derived By implementing AI for pattern recognition, thresholds are dynamic and

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according to their probability of fraud so that there are likely to be fewer false builds cases of suspected fraud from individual alarms and prioritizes cases the analysis layer correlates alarms generated from common network incidents, several analysis functions to generate cases. In a fraud detection implementation, The analysis layer receives alarms from the detection layer and performs

implementation. positives at the top of the priority list than at the bottom. The analysis layer a core infrastructure and a configurable, domain-specific

related to earlier events single fraud case which lists each violation. correlate over time. Thus, an event subsequent to the event listed above can be violating one or more profiling rules. The alarms can be consolidated into a a single event can violate one or more thresholding rules while simultaneously alarms that are generated by one or more detection layer engines. For example, The analysis layer employs a fraud case builder to correlate multiple The fraud case builder can also

generate additional fraud cases based upon the calling number, the called number, on the implementation layer analysis rules, the fraud case builder can also case indicating all of the violations associated with the credit card. Depending rules or profiles. The fraud case builder can correlate all such calls into a fraud is charged to that same credit card can violate the same rule or other thresholding violate a threshold rule pertaining to the length of a call. A subsequent call which For example, a telephone call that is charged to a particular credit card can

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tailored as necessary. includes rules for analyzing alarms. The rules are user specific and can be databases, relational database, etc. The domain-specific implementation also one or more databases such as, for example, flat files databases, object oriented Preferably, the configuration database is a user-configurable database including enhancer. A configuration database indicates the data necessary for enhancement. configurable informant for retrieving data from external systems for use by an The domain-specific implementation of the analysis layer includes a

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expert system layer includes a prioritizer for prioritizing cases, such as fraud automated analysis of cases and automates decision support functions. The expert system layer receives cases from the analysis layer, performs

that are employed by the detection and the analysis layers. External systems external systems. The expert system layer informant is similar to the informants that automatic action, such as terminating an account, is warranted provide data that can be used in determining whether a fraud case is so obvious systems. The informant interfaces with external systems in formats native to the cases, for example, and an informant for retrieving additional data from external

systems which will implement the action. The enforcer includes a configurable systems for interfacing with external action systems in formats native to the external domain-specific implementation that includes user-specific interfacing protocols activity, the enforcer sends necessary commands to one or more external action prioritizer determines that automatic action is required to stop a fraudulent action systems. For example, in a fraud detection implementation, when the The expert system layer includes an enforcer for interfacing with external

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rules for use by the prioritizer to determine what action to take on fraud cases. on prior experience. prioritizing cases. These rules are generally user-specific and are typically based implementation includes prioritization rules for use The expert system layer includes a core infrastructure and a configurable, domain-specific The domain-specific implementation also includes action implementation. by the prioritizer for The domain-specific

implementation includes automatically initiated by the expert system layer. human operators. Human operators can initiate action independent of any action The presentation layer receives cases for presentation to and analysis by a core infrastructure and a configurable, The presentation layer domain-specific

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and can be implemented in software, firmware, hardware, or any combination System technologies within a layered logical systems architecture. thereof. The present invention employs Artificial Intelligence (AI) and Expert The present invention is scalable, configurable, distributed and redundant

and automated analysis are provided. to detect new methods of fraud are all enhanced. In addition, dynamic thresholds configurability of detection criteria, portability to multiple enterprises and ability

described in detail below with reference to the following drawings. structure and operation of various embodiments of the present invention, are Further features and advantages of the present invention, as well as the

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Brief Description of the Figures

a person skilled in the pertinent art to make and use the invention. description, further serve to explain the principles of the invention and to enable of the specification, illustrate the present invention and, together with the The accompanying drawings, which are incorporated herein and form part

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Figures, wherein: The present invention is described with reference to the accompanying

processing system, including a detection layer, an analysis layer, an expert system layer and a presentation layer, implemented as a telecommunications fraud detection system; FIG. 1 is a block diagram of a multi-layer event record detection and

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and acting upon fraud in a telecommunications system; FIG. 2 is a high-level process flowchart illustrating a method for detecting

the present invention; FIG. 3 is a block diagram of a distributed architecture for implementing

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recognition process; illustrating a rules-based thresholding process, a profiling process and a pattern FIG. 4 is a process flowchart expanding upon step 214 of FIG. 2,

be used in the detection layer of the present invention; FIG. 5A is a block diagram of a rules-based thresholding engine that can

	to represent features associated with data records;	FIG. 5B is a high-level block diagram of a feature vector that can be used
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FIG. 5B; FIG. 5C is a detailed block diagram of the feature vector illustrated in

based thresholding engine depicted in FIG. 5A; FIG. 5D is a block diagram of an alternative embodiment of the rules-

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detection layer of the present invention; FIG. 6 is a block diagram of a profiling engine that can be used in the

recognition engine that can be used in the present invention; FIG. 7 is a block diagram of an artificial intelligence-based pattern

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FIG. 4 and for generating cases therefrom; generated by the rules-based thresholding process and the profiling process of FIG. 8 is a process flowchart illustrating a process for analyzing alarms

FIG. 9 is a block diagram of the analysis layer of FIG. 1;

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cases and for taking appropriate action upon certain of those prioritized fraud FIG. 10 is a process flowchart illustrating a method for prioritizing fraud

FIG. 11 is a block diagram of the expert system layer of FIG. 1;

FIG. 12 is a block diagram of the presentation layer of FIG. 1; and

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present invention. infrastructure and a user-specific, or domain-specific, implementation of the FIG. 13 is a block diagram illustrating a relationship between a core

reference number first appears digit(s) of a reference number typically identifies the drawing in which the indicate identical or functionally similar elements. Additionally, the left-most accompanying drawings. In the drawings, like reference numbers typically The present invention will now be described with reference to the

Detailed Description of the Preferred Embodiments

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- Profiling
 Pattern Recognition
- B. Analysis Layer

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- C. Expert System Layer
- D. Presentation Layer
- IV. Conclusions

I. Overview

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includes a detection layer for detecting thresholds, profiles and patterns for can be implemented as a portable software suite. The multiple layer architecture software, firmware, hardware or any combination thereof. The present invention configurable, distributed and redundant system that can be implemented in purchasing patterns), etc. The present invention is a multi-layered, scalable, analysis (i.e., to segment strong potential customers and to detect consumer patterns in, for example, telecommunications fraud detection, data mining, market program product for detecting and automatically acting upon new and evolving The present invention is a configurable system, method and computer

alarms into cases, an expert system layer for acting upon cases and a presentation layer for presenting cases to human users. generating alarms, an analysis layer for analyzing alarms and for consolidating

specific applications or domain-specific, implementation 1312 that permits each layer to be tailored for alteration. The invention also includes a configurable, rules-based, user-specific, permits each layer to be implemented in a variety of applications without Referring to FIG. 13, the invention includes a core infrastructure 1310 that

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implemented as software, firmware, hardware or any combination thereof. Core infrastructure 1310 and domain-specific implementation 1312 can be telecommunications fraud, credit card and debit card fraud, data mining, etc. configured for use in a variety of applications such as, Domain-specific implementation 1312 permits the present invention to be

substantial tailoring of the system to user-specific situations applications, without redesign. Domain-specific implementation 1312 permits interacting parameters. Core infrastructure 1310 can be used in a variety of case prioritization and action rules, presentation parameters and external system profiles, pattern recognition rules, alarm correlation and reduction rules, fraud of the actual implementation environment. Domain-specific implementation 1310 includes user-specific data and functions such as thresholding rules, Core infrastructure 1310 includes elements that are required, regardless

provisioning rules. prioritization rules, presentation rules, and dispatching rules, including normalization rules, provide flexibility. Configurable rules include event recognition rules, event Domain-specific implementation 1312 includes configurable rules to enhancement rules, detection rules, analysis rules,

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specify how to map sets of detection rules to events, such as, for example, by normalization rules specify how to normalize the events. Event recognition rules specify how to recognize incoming events. Provisioning rules

identification from an incoming event. information from existing information, such as how to derive product customer or by product. Enhancement rules specify how to derive new

detection layer, based on the type of rule violated. suspected fraud. Detection rules can include thresholding rules and profiles of Detection rules also specify alarm priorities for alarms generated in the Detection rules specify how to generate alarms in reaction to events of

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data to a rule set, partitioning data and deciding which engine to send data to. Dispatching rules, which include provisioning rules, are used for provisioning automatic actions. Presentation rules specify how to display information to users. alarms into fraud cases. Prioritization rules specify how to prioritize cases for Analysis rules further prioritize alarms and specify how to correlate

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does not affect existing alarms. were generated from the rule. For example, deleting an alarm type definition rule arrive at the system. Generally, rules are not applied to previously received running. When a rule is created or modified, it will be applied to new events that Rules can be created or modified and take effect while the system is When a rule is deleted, its deletion does not affect values or entities that

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These can include, but are not limited to, one or more of the following values. Domain-specific implementation 1312 also includes configurable values.

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the time-out period. rules will determine what event to take upon failure to receive a response within external database, the system will wait only for the time-out period. Configurable for a response from a database. For example, if a request for data is sent to an A database time-out variable specifies a maximum amount of time to wait

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specifies the number of messages which can be received and the time period over which to measure this expected number of messages An expected volume of data from a data management layer variable

of old events variable specifies the number of events older than the maximum age whenever this variable is exceeded. for arriving events. Typically, a network management message is generated variable can be used to increment a counter of old events. A maximum number between event creation and event arrival from a data management layer. This A maximum age for arriving events variable specifies the maximum time

number of invalid events which can be received from a data management layer. is exceeded. Typically, a network management message is generated whenever this variable A maximum number of invalid events variable specifies the maximum

threshold can go unprocessed before being reportable. time variable specifies the maximum time that a case above the case-high priority which cases are monitored if they go unprocessed. A maximum case unprocessed A case-high priority threshold variable specifies a priority level above

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used for reporting purposes. period over which rules performance will be measured. This variable is typically A rules performance measurement time period variable specifies a time

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alarms, cases determined to be fraudulent, cases determined to be other than of data items. Data items can include invalid events, valid and normalized events, fraudulent and actions taken A variety of purge time variables specify time periods for storing a variety

II. Example Environment

as, for example, telecommunications fraud detection, credit card and debit card of the present invention, not to limit the present invention The examples that are described herein are provided to assist in the description described below as implemented as a telecommunications fraud detection system. fraud detection, data mining, marketing analysis, etc. The present invention is The present invention can be configured for a variety of applications, such

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included. telephone companies, and Competitive Access Providers (CAPs) can also be operated by Regional Bell Operating Companies (RBOCs), independent local and digital cellular services. Local exchange networks (LEC) 106, such as those also include cellular and wireless networks 104, which offer conventional analog A variety of services can be supported by such networks. Network layer 101 can coverage, such as those of MCI Telecommunications and British Telecom (BT). 102 which can include conventional IXC networks with domestic and global Global/Inter-Exchange Carrier (IXC) public switch telephone network (PSTN) depicted in network layer 101 of FIG. 1. Network layer 101 can include a telecommunications networks. Several such telecommunications networks are Telecommunications systems can include any of a variety of types of

virtual network or 800 call routing. SCPs issue records for each transaction they 110 can be used to provide data and intelligence for enhanced services, such as and data call it processes. In addition, a plurality of service control points (SCP) plurality of switches 108 for issuing Call Detail Records (CDR) for each voice control layer 107 can support Global/Inter-Exchange Carrier PSTN 102 with a representing each instance of a particular service offering. For example, service telecommunications services and creates service records which contain data service control layer 107 offers and manages

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process. These records are referred to herein as Application Data Field (ADF)

as enhanced operator service records (EOSR), which include an ISN BDR which operator assisted calls can be sent from a network information concentrator (NIC) bad billed number (BBN) records, for such services. In addition, completed IN commonly referred to as Billing Detail Records (BDR), and intelligent services offerings, such as operator services. Components from INs 112 can issue records, is matched with a switch format (EOSR). Intelligent networks (IN) 112 can be provided for enhanced service

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carried by the IXC network. example, Initial Address Messages, which contain data pertaining to a call being processing call signaling messages. STPs 114 issue messages, such as, for referred to as SS7 networks, which use these signal transfer points (STP) 114 for Signal transfer points (STP) 114 can be employed for signaling networks,

and the local exchange of long-distance calls. components 118 of a LEC network 106 for issuing AMA records for local calls components 116 for issuing standard AMA records for cellular calls handled by cellular network 104. Service control layer 107 can include LEC service control Service control layer 107 can also employ cellular service control

records. ADFs, BDRs and IAMs can be issued prior to a call completing. CDRs, EOSRs and AMAs are issued after a call completes. A single call can traverse multiple networks and generate multiple call

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external systems the same call, and enhancing data by augmenting records with pertinent data from reducing data by eliminating redundancy and consolidating multiple records for event records can include partitioning data among various distributed processors, that can be used by a variety of systems. Processing of data to produce network service control components and processes them to produce network event records A data management layer 119 collects the various service records from the

reference databases 122 to provide external data for enhancement. incorporated herein by reference in its entirety. NIC 120 can utilize one or more network element codes. reference data can include customer identification codes, service type codes and specified and claimed in co-pending U.S. application, Serial Number 08/426,256, Preferably, component 120 is a Network Information Concentrator (NIC), as and can include a data partitioning, reduction and enhancement component 120. Data management layer 119 can be implemented in a variety of manners

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by fraud each of the telecommunications networks within network layer 101 are affected transactions. Each of these types of calls are subjected to fraudulent use. Thus, free 800 calls and cellular calls. They can also include credit card and debit card calls, credit card calls, customer premise equipment (CPE) calls, dial 1+ calls, toll 101 can handle or process any of a variety of types of calls such as calling card Typically, each of the telecommunications networks within network layer

III. Processing Event Records

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alarms, thus reducing the amount of analysis which must be performed on Multiple alarms are correlated into fraud cases based on common aspects of the thresholding rules and profiles. Violations result in the generation of alarms. the present invention detects fraud by comparing network event records with for detecting and acting upon fraud in one or more telecommunications networks, computer program product for detecting and acting upon data patterns suspected incidents of fraud. The present invention provides a multi-layered system, method and When implemented as a telecommunications fraud detection system

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reduce losses stemming therefrom. The system automatically acts upon certain cases of detected fraud to In addition, live analysts can initiate

generated for protecting the telecommunications system. newly detected methods of fraud, new thresholds and profiles are automatically network event records to discern new methods or patterns of fraud. From these additional actions. In a parallel operation, calling patterns are analyzed via

and handling fraud in a telecommunications system, such as that shown in FIG. a fraud detection system 169. The present invention includes a detection layer combination thereof. 1. The process can be performed with software, firmware, hardware, or any 143. In FIG. 2, a high-level process flowchart illustrates a method of detecting 123, an analysis layer 133, an expert systems layer 139 and a presentation layer Referring to FIG. 1, the present invention is illustrated as implemented as

single call can generate multiple call records. call, as described above. Because a single call can traverse multiple networks, a according to the type of call and the network equipment which handle a particular network layer 101. Service record formats and the data contained therein vary service control layer 107 for calls handled by the telecommunications systems in The process begins at step 210, where service records are generated by

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augmenting records with pertinent data from external systems. and consolidating multiple records for the same call, and enhancing data by among various distributed processors, reducing data by eliminating redundancy to generate network event records. This processing includes partitioning data In step 212, service records are processed by data management layer 119

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possible fraud. described below. In step 214, network event records are analyzed by detection layer 123 for Step 214 is further detailed in the flowchart of Figure 4, as

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and is scalable and distributed with a configurable component to allow for of network layer 101 services. Detection layer 123 is part of the infrastructure customization in accordance with user requirements. Preferably, detection layer Detection layer 123 specifies and executes tests to detect fraudulent use

system with unprecedented flexibility. scalable and distributed engines can be run together or separately and provide the engine 124, a profiling engine 128 and a pattern recognition engine 132. related software processes, operating on similar hardware components Preferably, these three classes of engines include a rules-based thresholding 123 includes three classes of processing engines, which are three distinct but

normalize network event records and to dispatch the normalized records to the dynamic in that the standardized formats can be varied according to the needs of for processing within detection layer 123. Preferably, the normalizing process is converting variously formatted network event records into standardized formats various processing engines. Normalization is a process or processes for A normalizing and dispatching component 124 can be employed to

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subset of the normalized network event records to particular paths of fraud a subset of the available information, time and resources are conserved by sending only the necessary information. detection and learning. Thus, where a particular processing engine requires only Dispatching is a process which employs partitioning rules to pass some

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records to selected thresholding rules. If a record exceeds a thresholding rule, are sent to analysis layer 133. the event is presumed fraudulent and an alarm is generated. Thresholding alarms event records from network information concentrator 120 and compares these Rules-based thresholding engine 124 constantly reads real-time network

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profile, a probability of fraud is calculated based on the extent of the departure profile database 130. Profiling engine 128 then compares event data with appropriate profiles from a which can be specified in the implementation layer by each user architecture. from network information concentrator 120 and from other possible data sources Profiling engine 128 constantly reads real-time network event records If an event represents a departure from an appropriate

and an alarm is generated. The profiling alarm and the assigned probability of fraud are sent to an analysis layer 133

updated dynamically to correspond to the latest methods of fraud analysis will detect new fraud profiles so that threshold rules and profiles are time by an artificial intelligence-based pattern recognition engine 132. This AI Preferably, in step 214, network event records are also analyzed in real-

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developed. In order to detect new methods of fraud and to generate new methods of fraud and to update the fraud detecting engines, including engines 126 all other levels of the system, to discern anomalous call patterns which can be event records including data from network information concentrator 120 through thresholds and profiles, pattern recognition engine 132 operates on all network and 128, with new threshold rules and profiles, respectively, as they are indicative of fraud. Pattern recognition engine 132 permits detection layer 123 to detect new

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pattern is to be considered fraudulent. abnormal pattern is detected, pattern recognition engine 132 determines if this patterns and determine if interesting, abnormal patterns emerge. When such an technology, pattern recognition engine 132 analyzes call histories to learn normal records for analyzing call histories. Utilizing artificial intelligence (AI) Pattern recognition engine 132 collects and stores volumes of event

to possible fraud patterns references can be applied to the pattern recognition analysis process as indicators systems 136 as references to current accumulations and payment histories. These engine 132 also uses external data from billing and accounts receivable (AR) historical data, types of patterns to look for as fraudulent. Pattern recognition AI technology allows pattern recognition engine 132 to identify, using

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fraudulent patterns, it uses these results to modify thresholding rules within the thresholding engine 226. For example, pattern recognition 132 can determine Once pattern recognition engine 132 has established normal and

parametric thresholding systems for fraud detection. methods of fraud, thereby providing a key advantage over conventional modifying threshold rules, the system is able to keep up with new and emerging event data is received which reflects that particular pattern. Thus, by dynamically thresholding rule within thresholding engine 126 which will generate an alarm if fraudulent 80% of the time. Pattern recognition engine 132 can then modify a that credit card calls to a specific country, which exceed 50 minutes in length, are

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pattern recognition engine 132, pattern recognition engine 132 updates the modified to keep up with new and emerging methods of fraud. profiles within the profile database 130. This allows profiles to be dynamically Similarly, once normal and fraudulent patterns have been established by

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within one hour using the same single credit card, and the ninth and tenth calls is charged to a particular credit card at the same time. If ten calls are placed Suppose also that another threshold rule generates an alert if more than one call exceeding ten calls per hour and one for exceeding one call per card at a time. number) then two alarms would be generated at the same time. One alarm for were made simultaneously (two different callers using the same credit card calls charged to a single credit card are made within a one hour time frame example, suppose a threshold rule generates an alarm if more than ten credit card In step 216, alarms are filtered and correlated by analysis layer 133. For

event of any future attempted use of the identified credit card. a new threshold rule can be generated to cause an alarm to be generated in the different threshold rules. In addition, if a pattern recognition engine is employed, into a single fraud case indicating that a particular credit card has exceeded two A correlation scheme for step 216 might combine the above two alarms

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consolidates these alarms into fraud cases. different alarms which were generated from the same or related events and analysis layer 133. Analysis layer 133 analyzes alarm data and correlates Alarms which are generated by the detection layer 123 are sent to the This reduces redundant and

a cellular phone is occurring. An alarm database 138 stores alarms received from multiple services. For example, different alarms can be received for possibly the detection layer for correlation. within analysis layer 133 can determine that fraudulent use of a credit card over fraudulent use of calling cards and cellular phones. The correlation process cumulative data and permits fraud cases to represent related fraud occurring in

an occasional exceeding of a threshold by an authorized user or by an abnormal in the first place layer 133 employs artificial intelligence algorithms for prioritization on business travel, are typically assigned a low priority. Preferably, analysis calling pattern by an authorized user, such as calling from a new country while of the priority list than at the bottom. Thus, fraud cases which are generated due probability of fraud so that there are likely to be fewer false positives at the top Alternatively, detection layer 123 rules can be customized to prevent such alarms Analysis layer 133 prioritizes the fraud cases according to

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component 134 which performs the consolidation, correlation, and reduction database 138 resides on the same hardware as software component 134. AR systems 136 in the correlation and reduction processes. Preferably, alarm functions. Software component 134 makes use of external data from billing and In a preferred embodiment, analysis layer 133 includes a software

functionality is supported by the network. fraud-preventive action. In addition, any pending calls can be terminated if such responsible credit card company of the suspected fraud so that they can take for automatically executing one or more tasks in response to certain types of fraud Thus, in the example above, automatic action can include notifying the In step 218, consolidated fraud cases are sent to expert system layer 139

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system 140, which applies expert rules to determine priorities and appropriate actions. An off-the shelf expert system can be used. expert system layer 139 includes a fraud analysis expert Preferably, however, a

language appropriate for expert systems, such as, for example, CLIPS customized expert system is employed and is programmed using a rules-based

or honored by the customer. such as, for example, a history of similar activity which were later accounted for not too potentially expensive or where certain mitigating circumstances exist, automatic responses where, for example, the suspected fraud is not so flagrant or of suspected fraud which are so egregious that automatic responses are Typically, algorithms for step 218 are designed to identify certain cases However, these algorithms can also be designed to withhold

automated actions employ artificial intelligence for controlling execution of automated or semiinitiating actions to be taken on a customer's service. Expert system 140 can system 142 for retrieving data relating to services provided to a customer and for deactivation notifications and a system 148 for instituting switch-based ANI include a system 144 for issuing dunning letters, a system 146 for issuing purpose of performing various actions in response to detected fraud. These can Expert system 140 includes interfaces to several external systems for the Expert system 140 can include an interface to a service provisioning

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cases, included those which caused automatic responses in step 218 and those action for which the automated system is not capable. Thus, in step 220, all fraud which did not are sent to a presentation layer 143 for presentation to human to provide all cases of suspected fraud to live operators so that they can take some Regardless of whether automatic responses are generated, it is important

LAN 150 is referred to, it should be understood that a WAN or any other suitable interfacing system. Thus, throughout the remainder of this document, where network LAN 150, a wide area network (WAN), or via any other suitably 152a-152n connected to the each other and to expert system 140 via a local area Presentation layer 143 preferably includes a plurality of workstations

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software which provides a graphical user interface (GUI) to the system conventional personal computers and can operate as clients having specific interfacing system can be substituted. Workstations 152a-152n can be

flexible scripting language which forms part of the infrastructure component of to various external systems. Presentation layer 143 can include a customized, taken in response to detected fraud. Such actions are executed through interfaces human analysts operating from workstations 152a-152n to initiate actions to be workstations 152a-152n via LAN 150. Presentation layer 143 also allows for expert system layers can thus be presented to human analysts via Fraud data that has been collected and processed by the detection, analysis

use of the card in the future will not generate alarms. threshold rules or profiles are altered for this particular credit card so that similar calls are authorized and that the billing will be honored, no further action can be than ten calls within one hour. If the credit card issuer or owner indicates that the simultaneous credit card calls and that the credit card has been used to make more or owner to inform them that the credit card is being used to make two automatic action, a live operator could, nevertheless, contact the credit card issuer The live operator can even input data into the system so that, in step 214, In the example above, if the automated system does not trigger an

generate an immediate automatic response including terminating the attempted into the system so that, in step 218, any alarms generated by that credit card attempted to be billed to that credit card. The live operator can also input data that, in step 214, alarms are immediately generated if even a single call is calls, if they are still in progress and if the monitored network supports such are not authorized, the live operator can take action to immediately disconnect the functionality. Furthermore, the live operator can input data into the system so Alternatively, where the credit card issuer or owner indicates that the calls

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based on the card are blocked before any substantial analysis is performed. call. Alternatively, the operator can initiate deactivation of the card so that calls

consolidation, correlation and reduction unit 134, an alarm database 138 and a engine 128, a profile database 130, a pattern recognition engine 132, an alarm components preferably include a rules-based thresholding engine 126, a profiling operate on one or more servers such as servers 310a-310n. make up detection layer 123, analysis layer 133 and expert system layer 139 other system, which can be LAN 150. Preferably, the logical components that system 169 is a client/server based system which operates on a LAN, WAN or fraud analysis expert system 140. Referring to FIG. 3, a preferred physical architecture of fraud detection These logical

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provide an interface between fraud detection system 160 and human analysts. systems utilized by the detection layer. Fraud analyst workstations 152a-152n can include a billing and accounts receivable component 136 and various other enhancement of internal processes and data in the system. External systems 316 network information concentrator 120. External systems 316 can provide data for management layer 119 which preferably includes the previously described Network event records 314 are provided to servers 310a-310n from data

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A. Detection Layer

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processes of FIG. 4 are provided in FIGS. 5A, 5D, 6, and 7. In one preferred and a pattern recognition process (steps 430-438). Systems for implementing the thresholding process (steps 412-420), a profiling process (steps 422-428 and 420) can be performed by detection layer 123. These processes include a rules-based For example, the system can be implemented on a plurality of server components embodiment, the system is implemented in a distributed processing architecture. Referring to FIG. 4, a process flowchart illustrates various processes that

1. Normalization and Dispatching

process is dynamic in that the standardized formats can be varied according to the multiple paths of fraud detection and learning. Preferably, the normalization various formats to standardized formats that are recognized by each of the Normalization is a process for converting network event records of

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to particular paths of fraud detection and learning in detection layer 123. to a rule set or detection method. receive data. Partitioning rules balance loads among multiple processors assigned determine which rule set or detection method within detection layer 123 will Dispatching includes provisioning rules and partitioning rules. Provisioning rules Dispatching is a process for forwarding normalized network event records

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such as an IAM, BDR, BBN and ADF. Operation of normalizer and dispatcher and received by the Data Management Layer 119 prior to completion of the call, a call completes, such as a CDR, EOSR and AMA, and those created during a call data management layer 119. Network event records include those created when provided for normalizing and dispatching network event records 501, sent from 124 is described with reference to the flowchart of FIG. 4. Referring to FIGS. 5A, 5D, 6, and 7, normalizer and dispatcher 124 is

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of the data management layer into standardized formats required by the detection infrastructure 1310 and a user-specific or domain-specific implementation 1312. dispatcher 124. Normalizer and dispatcher 124 preferably includes a core A normalizer 502 converts network event records 501 from the various formats In step 408, network event records 501 arc received by normalizer and

network event records 501 into normalized event records 506. Configuration data 504 is user-dependent and thus is part of domain-specific implementation 1312 In step 410, normalizer 502 uses configuration data 504 to convert the 25

506c, which are sent to pattern recognition engine 132 which are sent to profiling engine 128, and normalized network event records to rules-based thresholding engine 126, normalized network event records 506b, dispatcher 508 provides normalized network event records 506a, which are sent 506 to appropriate detection-layer engines 126, 128 and 132. In one embodiment, employs user-specific dispatching rules to pass normalized network event records Normalized network event records 506 are then sent to dispatcher 508 which

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storage period can, for example, be set to twenty four hours preferably stored for a period of time that can be designated by the user. A 125 for use by one or more engines within detection layer 123. Events are Normalizer 502 also stores network event records in an event database

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detection processes are made be made to the normalizer process whenever modifications to downstream configuration data 504 and dispatcher 508 also permit quick and easy updates to to the requirements of the enterprise into the dispatcher 508. Normalizer 502, normalizer 502 to be configured for any enterprise by programming data specific Dispatcher 508 allows the fundamental process being performed by

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2: Rules-Based Thresholding

represent possible fraudulent use of a telecommunications network compared to threshold rules to determine whether the network event records network event records represent telephone calls, network event records are to threshold rules. In a telecommunications fraud detection system, where Thresholding is a process whereby network event records are compared

engine 126 are provided for implementing the thresholding process of steps 412rules-based thresholding process. In FIG. 5A, details of rules-based thresholding Referring to the process flowchart of FIG. 4, steps 412-420 represent a

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following terms are used: 420. In describing the elements and process of thresholding engine 126, the

telecommunication fraud detection implementation, an event is typically a telephone call in thresholding engine 126. An event, represented by a normalized event record 506a, generates a Features are defined below.

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measured to calculate a feature value. generating event is typically the most recent event of a series of events that are A generating event is an event that caused a feature to be generated.

it typically consists of one generating event and several contributing events. contributing event for calculation of other features received, it generates the calculation of a feature. The event can then become a Every event that is received is at first a generating event, in that when it is cause the feature to be generated. While a feature can consist of a single event, A contributing event is an event that contributed to a feature, but did not

etc. A key is used to identify an event type. A key is an event field, such as ANI, calling card number, call destination,

enhancer 510 in accordance with enhancement rules 512, and with data from one the number of calls made with a certain calling card number in a two hour period determine whether evidence of fraud exists. A feature can include, for example, or more events. A feature can also be, for example, an NPA of a call. Features are calculated by A feature is information that is used by the threshold detector 520 to

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generating event and include no contributing events. For example, a single event from a generating event and zero or more contributing events. Multiple event feature can be a call made from a hot ANI. Multiple event features are derived multiple event features. features are the result of measurements performed on a key for a period of time There are generally two types of features, single event features and Single event features are derived from a

calling card number within a period of time. such as, for example, a measurement of the number of calls made with certain

identifying a collection of features. In a preferred embodiment, enhancer 510 includes one or more feature vector segments as, for example, feature vector 518. A feature vector, such as feature vector 518, generates feature vectors 518 and passes them to threshold detector 520. Referring to FIG. 5B, features can be represented by feature vectors such 532, 534, 536, 537, etc., for

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provided where each feature vector segment 532-536 preferably includes a feature card number, an ANI, a credit card account number, a calling number, etc. name field, or key feature field, 538-542, respectively, for identifying a particular key feature. For example, a key feature field might indicate a particular calling Referring to FIG. 5C, a preferred embodiment of feature vector 518 is

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respectively, for providing a value for associated feature name fields 538-542. feature value field 546 might provide the number of calls made within the past calling card. 544 might provide the number of calls made within the past two hours with that as the key feature represented by feature vector segment 532, feature value field For example, if feature name field 538 identifies a particular calling card number two hours from that ANI. Each feature vector segment 532-536 includes a key value field 544-548, Similarly, if feature name field 540 identifies a particular ANI,

calling card, the most recent of those four calls is the generating event for feature 544 specifies that four calls were made in the past two hours with a particular event which is counted in a value field 544-548. For example, where value field caused a feature to be generated. A generating event is typically the most recent feature vector segment 532-544. Recall that a generating event is an event that Generating event fields 550-554 identify a generating event for each

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contributed to features vector segments 532 and 536, respectively. Using the Contributing event fields 556-560 and 562-566 represent events which

therefore, represents a single event feature such as, for example, a hot ANI call vector segment 534 includes no contributing events. Feature vector segment 534, contributing event fields 556-560 represent the prior three calls. Note that feature hours and where generating event field 550 represent the fourth one of those calls, example above, where value field 544 specifies four calls within the past two

events, feature vector segments 532-536 are, nevertheless related through one or more common aspects of their generating events and/or contributing events Although generating event fields 550-554 can identify different generating

made within the past two hours with a particular calling card so that generating single instance of a call made from the hot ANI. Feature vector segments 532 segment 534 can represent a hot ANI and generating event 552 can identify a example, the past two hours with that calling card. In addition, feature vector event 550 and contributing events 556-560 represent calls made within, for represented by feature 532, from the hot ANI represented by generating event contributing events 556-560 identify a call that is made with the calling card and 534 are said to be related if one or more of generating event 550 and For example, a feature vector segment 532 can represent calling card calls

a core infrastructure 1310 and a domain-specific implementation 1312. or more configurable rules. alarms 526 in the event that one or more network event records 506a violate one for applying configurable rules to network event records 506a and for generating infrastructure 1310 includes an enhancer and threshold detection component 509 Referring back to FIG. 5A, thresholding engine 126 preferably employs

event records 506a. Key features can include, for example, ANI, credit card generates a feature vector for identifying one or more key features associated with enhancer component 510 and at least one or more threshold detector component Enhancer component 510 receives network event records 506a and Enhancer and threshold detection component 509 includes at least one

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a feature vector is referred to as a generating event. number, calling number, etc. A network event record that triggers generation of

even be executed while the system is running. according to evolving needs of a user. Changes to thresholding rules 522 can configuration database 512 and a threshold detection rules database 522. created or modified, it will be applied to new events that arrive at the system. Databases 512 and 522 include rules that can be created, deleted or modified Domain-specific implementation 1310 includes enhancement rules and When a thresholding rule is

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to apply appropriate threshold detection rules. calculation of a feature vector. Threshold enhancer component 510 augments detection of other enterprises. modularity to the system for both ease of configurability and portability to fraud configuration data 512, analogous to normalizer configuration data 504, provides to find this data, and how to add it to event records. Thresholding enhancer configuration data 512 specifies data which is required for enhancement, where Augmentation can provide additional data which enable threshold detector 520, rules specify the fields which are to be kept, omitted, formatted and augmented normalized event records 506a to produce feature vectors 518. Enhancement event, when it is received, is treated as a generating event, in that it generates the received by enhancer component 510 within thresholding engine 126. Each With reference to FIG. 4, in step 412, normalized event records 506a are Enhancement rules and

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enhancer 510 can be retrieved. External systems 516 can include customer order enhancement rules and configuration data 512, can request enhancement data entry systems and network engineering systems. one or more external systems 516 from which additional data needed by the from an informant 514. Informant 514 provides a communication interface to Threshold enhancer component 510, based on instructions from

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component 510, informant 514 sends a query to an appropriate external system Based on a request that informant 514 receives from threshold enhancer

receives the requested data and supplies it to enhancer 510. 516, using a communications protocol of the external system 516. Informant 514

systems 516 and can be easily reconfigured for fraud detection systems of other 514. Thresholding engine 126 can thus be interfaced to a variety of external various external systems 516 by simply modifying interfaces within informant Informant 514 thus provides modularity that allows adding and removing

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and configuration data 512, for that event type card call, a key can be the calling card number field of the event record. determines the type of event based on a key. For example, if the event is a calling Enhancer 510 looks up a rule set, based on provisioning, in enhancement rules When enhancer 510 receives an event record 506a, enhancer 510

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a feature vector 518 using a certain measurement type. The resulting value of the feature is placed in or more features. A rule defines a feature and requests that feature be calculated features for an event type. A generating event can trigger the calculation of one A rule set includes one or more rules for specifying how to calculate

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any of the following measurement types: accordance with specifications in the enhancement rules and configuration data Each measurement type includes an algorithm used to calculate the value Multiple measurement types can be performed by enhancer 510, in For example, measurement types can include, but are not limited to

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- of calls in the past two hours); simple count: counts events in a given time period (i.e., number
- 9 Enhancer 510 looks up field in event. If the field value = a of an event field (i.e., number of calls with ANI = 202-555-1234). field count: counts events that meet a criteria for a certain value

	specified value, then Enhancer 510 adds the event to a list that
	will be counted;
3)	set count: counts events that meet a criteria for a set of values of
	a field so that, if a field in an event has a value that is a member
	of a set (as defined by an enhancement rule), then enhancer 510
	counts the event (i.e., number of calls originating in Texas, New
	Mexico, Arizona, or California);
4)	sum: sums a certain field from one or more events in a given time
	period (i.e., sum the duration of all calls made in past 2 hours);
5)	simultaneous: count calls (with certain criteria) that were made at
	same time, defined by minimum call duration overlap or
	maximum time separation (i.e., count all calls made with calling
	card number = nnn, that overlap by at least 2 seconds or that are
	made within 10 seconds of duration of another call made with
	same calling card number); and
9	geographic velocity: simultaneous calls over a distance. Rule will
	provide a minimum time needed between calls, based on physical
	distance between points of call origination. For example, if a call
	made with a certain calling card in a first city is placed less than
	4 hours after another call made with the same calling card in a
	second city, and the second city is more than 4 hours in traveling
	time from the first city, then add both events to list that will be
	counted.

in the list, and counts events in the list backward in time, until the time period is a count, enhancer 510 begins with the most recent event (the generating event) specifies a time period in which to include events for a measurement. To perform places each event in a list, the events being sequenced in time. Each rule To count events using any of these measurement types, enhancer 510

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covered. As a new generating event is received, enhancer 510 begins its count later in the list. This represents a sliding time window.

configuration data 512, using the ANI as a key. causes enhancer 510 to retrieve this particular rule from enhancement rules and first event meeting the ANI criteria is received, it is a generating event, and events in the past two hours in which the ANI equals a certain value." When a For example, suppose a rule specifies a field count, such as "count all

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counts all events in the list going back two hours from this second event. The first event, then this second event becomes a generating event. Enhancer 510 meeting the same criteria is received, with a time stamp 5 minutes later than the window slides forward by 5 minutes. first event becomes a contributing event to the second event. The two hour time from the generating event. Other events are contributing events. If another event Enhancer 510 places this event in a list of events that meet the same Enhancer 510 then counts all events in this list going back two hours

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common functions: The six measurement types that are described above have the following

- ۳ card number 202-555-1234); they each perform a measurement for a specific key (i.e., calling
- Ŋ sliding time window); an algorithm to each event within the given time period (the they each analyze all events which have the specific key and apply

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 ω recent event, and goes backward in time from there); and representing a time window (the time window is set by the most they each return a feature value for the given time period,

they are all persistent

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or more rules. generating event causes enhancer 510 to apply a rule set, a rule set including one set that is read from enhancement rules and configuration data 512. Each measurement on a generating event, in accordance with a rule that is part of a rule Continuing with the process of FIG. 4, enhancer 510 performs a

a feature vector, and places each feature in the feature vector. single generating event can result in one or more features. Enhancer 510 creates event identifier, which points to an actual event record in event database 125. a measured feature value, a generating event, and zero or more contributing The results of a measurement is a feature. Recall that a feature includes For performance reasons, each event in a feature is represented by an

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The following example is provided for a rule which can be, for example:

If calling card number = 123456789, then

create feature vector;

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calculate simple count: number of calls made in past 2 hours; calculate set count: number of calls from (list of pay phone ANIS) made in past 2 hours;

calculate simultaneous: number of calls made within 10 seconds of another call, in past 2 hours;

made with calling card number = 123456789. from enhancement rules and configuration data 512. Enhancer 510 uses the calling card number as a key, and retrieves the above rule Suppose that enhancer 510 receives an event 506a representing a call This is a generating event.

the generating event, enhancer 510 goes back two hours and counts all events Enhancer 510 then reads a list of all events from event DB 125. Beginning with Enhancer 510 then performs the rule by creating a feature vector 518.

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510 performs the simultaneous count. The result of each count, along with identifiers for each event that was counted, is added as a feature to the feature card number, from a pay phone ANI. This is the set count. Likewise, enhancer Enhancer 510 goes back two hours and counts all calls made with that calling representing calls made with that calling card number. This is the simple count.

equivalent to a default value of 1 (i.e., if 1 call with ANI = 202-555-1234). statement of truth (i.e., if ANI = 202-555-1234). A statement of truth is the feature vector as a feature. For example, feature 534 can represent a threshold a feature. Thresholds are included if called for by an enhancement rule, and are provided by enhancement rules and configuration data 512. They are placed in for feature 532. A threshold can be a value for measurement (i.e., "5" calls) or a Now enhancer 510 can also include in the feature vector a threshold for

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of determining if a threshold has been exceeded. This is described with reference to step 414, below threshold detection rules 522 by the threshold detector 520, as part of the process performed by threshold detector 520. Thresholds can also be obtained from values with thresholds, to determine if a threshold has been exceeded, is performs the measurements and creates the feature vector. Comparison of feature another feature. Enhancer 510 does not perform any comparisons, it simply in itself. But it is not necessary for every feature to have a threshold stated as A threshold for a feature can be included in the feature vector as a feature A feature does not include a threshold for itself. It is simply a measured

threshold detector 520 for application of threshold rules. In step 414, threshold rules are applied events to determine whether fraud In the preferred embodiment, feature vectors 518 are received by

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exists in a feature vector. Threshold detector 520 employs threshold detection Threshold detector 520 is responsible for determining if evidence of fraud

detection rules 522 specify how comparisons are to be made. rules 522 to perform comparisons of feature values against thresholds. Threshold

an ANI has been designated as a source of fraudulent calls, any call from that valued threshold is useful for true/false statements of a feature. For example, if vector, or can be obtained from the threshold detection rules 522. A threshold is identifying a single event that contains that ANI. ANI is considered evidence of fraud. A threshold comparison is simply made by generally a value for a measurement, which can be unity for default. A unity-A threshold for a feature can be included as another feature in the feature

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Threshold detection rules can include, for example, the following types of rules: detector 520 how to perform comparisons to determine if evidence of fraud exists. contains a feature value. Threshold detection rules specify to the threshold Each feature vector segment 532, 534, 536, and 537 is a feature, and each

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5 from Threshold Detection Rules 522); if A > "5", create evidence (threshold for A is a value obtained

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- 2 if A > B, create evidence (threshold for A is another feature in the feature vector);
- \mathfrak{S} statements); and if A > B #and# B > C, create evidence (can be complex
- 4 if D, create evidence (threshold is unity; useful for items like a hot ANI or a stolen calling card number).

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If an explicit value for a threshold is not given, it is assumed to be unity.

analyzing single-event features while the other pair 572 can be dedicated to pairs 570 and 572. One pair, which can be pair 570, can be dedicated to analyzing multiple event features. detector component 509 includes two sets of enhancer and threshold detector Referring to FIG. 5D, in a preferred embodiment, enhancer and threshold

more adequate and uniform throughput of data. be provided with two or more enhancers 510. Such an arrangement provides a enhancer and threshold detector pair 570, one or more threshold detectors 520 can performs simple comparisons. Thus, for added performance, as illustrated in needed for the various measurement types, while threshold detector 520 generally Generally, enhancers 510 generally perform complex calculations, as

modified in two ways, corresponding with two general formats of rules. in real-time, while thresholding engine 126 is executing. Preferably, rules can be Threshold detection rules 522 can be created and modified dynamically,

or created by modifying or creating the specific values in the table to a specific value in a table. Rules in this format can be dynamically modified of calls from pay phone ANI > nnn, create evidence", in which nnn is a pointer reference specific values in a table. For example, a rule can look like "If number In a first general format, a rule can be a general statement and can

modifying or creating the rule itself. create evidence". Rules in this format can be dynamically modified or created by For example, a rule can look like "If number of calls from pay phone ANI > 10, In a second general format, a rule can be hard coded with specific values.

pattern recognition engine 132. engine 132, threshold detection rules database 522 is updated automatically by embodiment, where rules are automatically generated by pattern recognition external pattern recognition engine 132 and manually by human analysts. rules 522 can be automatically created and modified both automatically by dynamically modified without taking the engine off-line. Threshold detection employing the engine. Preferably, threshold rules stored in database 522 can be Threshold detection rules 522 can vary according to the enterprise

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manually by human analysts. In this alternative embodiment, pattern recognition recognition engine 132, threshold detection rules database 522 is updated Alternatively, where rules are automatically generated by pattern

creating a threshold detection rule, it notifies a human analyst and suggests a new engine 132 is used to detect new patterns of fraud, but instead of automatically The human analyst can then enter the suggested rule or create a new rule.

to, rules for generating one or more of the following types of alarms 522. For example, threshold detection rules 522 can include, but are not limited A variety of types of rules can be implemented in threshold detection rules

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on the normalized event domestic. The call type category is determined from the international indicator call type categories such as targeted international, non-targeted international and duration exceeds a duration threshold, X. LD thresholds can be set by product for A long duration (LD) alarm is generated if a single completed call's

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the most specific threshold. Users could, however, implement a hierarchy if NPA-NXX, NPA or country code. There is no hierarchy required for applying be set by product. The origination X and termination Y can be specified as duration that exceeds Z. The duration threshold Z for a combination X and Y can generated if a completed call originating from X and terminating to Y has a desired. One event can generate more than one OTCD alarm. An originating, terminating combination duration (OTCD) alarm is

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the most specific origination and termination combination. One event can specified as NPA-NXX, NPA or country code. There is no hierarchy for applying generate more than one OTCA alarm. alarms can be set by product. The origination X and termination Y can be generated for a single attempt that originates from X and terminates to Y. OTCA An originating, terminating combination attempt (OTCA) alarm is

originates from X. A hot originating attempt (HOA) alarm is generated when a call attempt The origination X is contained in a list of pre-defined

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terminates to X. The termination X is contained in a list of pre-defined numbers. A hot terminating attempt (HTA) alarm is generated when a call attempt

call originates from X. The origination X is contained in a list of pre-defined A hot originating completion (HOC) alarm is generated when a completed

call terminates to X. The termination X is contained in a list of pre-defined A hot terminating completion (HTC) alarm is generated when a completed

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is a time parameter T. had originated. The measure of how recently the card must have been deactivated a call attempt originates from a number from which a recently deactivated card A deactivation hot originating attempt (DHOA) alarm is generated when

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a call attempt terminates to a number to which a recently deactivated card had a time parameter T. terminated. The measure of how recently the card must have been deactivated is A deactivation hot termination attempt (DHTA) alarm is generated when

been deactivated is a time parameter T. deactivated card had originated. The measure of how recently the card must have a completed call originates from a number from which a recently A deactivation hot originating completion (DHOC) alarm is generated

deactivated is time T. card had terminated. when a completed call terminates to a number to which a recently deactivated A deactivation hot termination completion (DHTC) alarm is generated The measure of how recently the card must have been

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the count infodigit. Call attempts with infodigits indicating pay phones are screened out of number of attempts X is accumulated across all PIN validated products based on attempts from the same origination fail PIN validation within time T. A pin hacking origination (PHO) alarm is generated when X number of

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of attempts on the same billed number fail PIN validation within time T. The A pin hacking billed number (PHBN) alarm is generated when X number

indicating pay phones are screened out of the count. PIN validated products based on infodigit. Call attempts with infodigits dropping the 4 digit PIN. The number of attempts X is accumulated across all billed number is calculated by dropping the last four digits from the BTN, i.e.,

events. An international call is determined from the international indicator in the which simultaneity is checked can not exceed the purge time for normalized international calls is specified by product. The sliding window of time T within at least 2 minutes within a sliding window of time T. completed international calls using the same authcode /BTN overlap in time by normalized event. A simultaneous international (SI) alarm is generated when X number of The X number of

is determined from the international indicator in the normalized event. is checked, can not exceed the purge time for normalized events. A domestic call domestic calls is specified by product. The duration T, within which simultaneity completed domestic calls using the same authcode/BTN overlap in time by at least 2 minutes within a duration T of the generating event. The X number of A simultaneous domestic (SD) alarm is generated when X number of

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purge time for normalized events. This alert includes both international and product. The duration T within which simultaneity is checked can not exceed the a duration T of the generating event. The X number of calls is specified by calls using the same authcode/BTN overlap in time by at least two minutes within domestic calls. A simultaneous all (SA) alarm is generated when X number of completed

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velocity check alarms can be calculated either by specifying time for authcode-plus-PIN/BTN originating from locations between which it would be combinations impossible for a caller to travel during the interval between the calls. Geographic A geographic velocity check is a check for a pair of calls using the same of originations and terminations or by specifying

performing a time calculation. latitude/longitude for each country or NPA and a maximum travel speed and

not simultaneous and each pair occurs within a sliding window of time T2. The authcode-plus-PIN/BTN, each pair occurs within a time interval T1, each pair is X number of pairs of calls is specified by product. when, for X number of pairs of international call completions using the same A geographic velocity check international (GVCI) alarm is generated

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the terminating time of the first call and the originating time of the second call. calls are made within a given interval is calculated from the difference between of the originating ANI's NPAs and/or country codes. Determining whether the The interval T1 for a pair of calls is determined by the pair's combination

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check is performed cannot exceed the purge time for normalized events. An international call is determined from the international indicator in the normalized The sliding window of time T2 within which the geographic velocity

the same authcode-plus-PIN/BTN, would have been impossible for a single caller of call completions, regardless of domestic or international classification, using generated when X number of pairs of domestic call completions, using the same to make A geographic velocity check all (GVCA) is generated when X number of pairs authcode-plus-PIN/BTN, would have been impossible for a single caller to make. Similarly, a geographic velocity check domestic (GVCD) alarm is

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indicating, by switch identification, the blocked country codes. a block in place to a blocked country. This type of alarm makes use of data country block (FCB) alarm can be generated if a call is made from a switch with are instances, however, where a country block on a switch fails. switch blocks can be configured to block such calls to a set of countries. There For certain types of calls, such as toll free or pay to dial calls for example, Thus a failed

can include detection rules comparable to current FMS ceiling and interval determined from an international indicator on the normalized event. CCI alerts targeted international and domestic call type categories. Thresholds can include cumulative call minutes, completed call counts and completed calls on an authcode-plus-PIN/BTN exceed one or more thresholds. cumulative dollars. A completed call interval (CCI) alarm is generated when one or more Thresholds can be based on targeted international, non-Call type category is

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threshold detector 520 will apply any rule that includes comparisons for those any features included in the feature vector. For example, in FIG. 5C, if a feature through threshold detection rules 522 and applies any rules that are designated for vector 518 includes features such as, for example, features 538, 540 and 544, In step 416, when threshold detector 520 receives a feature vector, it reads

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event record exceeds or violates the threshold rule, evidence, or an indication of possible fraud, is generated. action is necessary and the process stops at step 418. If, however, the network If the network event record does not exceed the threshold, no further

containing a priority indicator, account name, and a suspicious event set. to analysis layer 133, preferably with the evidence. that resulted in evidence of fraud. In step 420, if an indication, or evidence, of Suspicious event sets include a union of all events from the event sets of features contents of evidence are defined by implementation of the infrastructure. fraud is generated, threshold detector 520 generates an alarm 526, which is passed An indication, or evidence, of fraud preferably includes at least a record

events that are identified in a suspicious event set can be kept longer for analysis A storage period can, for example, be set to twenty four hours. In addition, stored in event DB 125 for a period of time that can be designated by the user. Recall that all events that are received by normalizer 502 are preferably 25

suspicion or can be stored in a separate database, so that they are not purged after the typical storage period. purposes. Suspicious events can be stored in event DB 125 with in indication of

. Profiling

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or more telecommunications networks. Profiling can require historical network profile of fraudulent use of a telecommunications network. event records to help determine whether a current network event record, fits a records are compared to profiles representing normal and fraudulent use of one Profiling is a process whereby normalized dispatched network event

implementing the profiling process of steps 422-428 and 420. Referring to FIG. 4, steps 422-428 and 420 represent a preferred process In FIG. 6, details of profiling engine 128 are provided for

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626 and 512. Configuration data 626 specifies which data is required, where to profiling. Preferably, enhancer component 510 and 625 have similar fundamental from configuration data 626, then requests this data from an informant 628 find it and how to add it to event records. Enhancer 624, based on instructions structures, yet operate differently through the use of specific configuration data enhancer 624 can use a different configuration data component 626 since enhancer 624 operates similar to thresholding enhancer 508 except that profiling enhancer 624 provides additional data for the profiling processor 634 that will different types of data can be needed to create an enhanced event record 632 for enable the application of appropriate profile detection rules 636. Profiling sent to profiling engine 128 and are received by profiling enhancer 624. Profiling The process begins in step 422, where normalized event records 506b are

be retrieved. Informant 628, similar to threshold informant 514, is used to retrieve external systems 630 from which additional data needed by the enhancer 624 will Informant 628 provides a communication interface to each of several

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receives the requested data and supplies it to enhancer 624 using the communications protocol of the external system 630. Informant 628 enhancer 624, informant 628 sends a query to the appropriate external system 630 of configurability and portability. Based on a request it receives from the data 626 and informant 628 components provides the current invention with ease required data from external systems 630. Again, the use of modular configuration

received from informant 628, and thus creates an enhanced event record 632. Enhancer 624 augments normalized event records 606b using data

determine which profile from the profile database 130 the event should match up profile detection rule 636, several of which are kept in a database. Rules 636 enhanced event record 632, the profiling process 634 selects an appropriate for applying against one or more profiles. Using certain parameters from the In step 424, a profiling processor 634 receives enhanced event records 632

can be an object database, a set of tables, a set of real numbers representing created as user, product, geographical, or global profiles. Profile database 130 patterns are stored. weighting factors for a neural network (as is used in AI technology), or other Profiles can be created in any of a number of ways. Profiles can be Preferably, profiles representing both normal and fraudulent

profiles and detect departures from normal profiles also trains itself to formulate profile rules 636 that allows it to match events to normal patterns received by pattern recognition engine 132 in order to build algorithms (rather than rules-based) to process volumes of known fraudulent and fraudulent and normal profiles. Preferably, an AI-based profiling processor 634 exist for such a purpose, the preferred embodiment utilizes statistical-based employs Artificial Intelligence (AI) technology. Although several AI systems In a preferred embodiment, profile development and profile matching 20

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the aid of Artificial Intelligence (AI) technology. Alarm 638 is then sent to a percentage or weighting factor. Preferably, at least step 426 is performed with calculated based on the significance and degree of departure and is expressed as analysis layer 133. generates an alarm 638 in step 420. Preferably, a probability of fraud is a departure from the selected profile is detected, profiling component 634 falls within the selected profile or profiles, testing stops at step 428. If, however, the profile database 130, and compares the event with the profile. In step 426, profiling component 634 retrieves an appropriate profile from If an event

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4. Pattern Recognition

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profiles. In FIG.7, details of pattern recognition engine 132 are provided for a preferred process for pattern recognition and for updating threshold rules and which self-teach fraudulent and non-fraudulent patterns from such feedback. engine 132 can receive feedback from other layers and can employ components implementing the pattern recognition process of FIG. 4. Pattern recognition in a telecommunications network. Referring to FIG. 4, steps 430-438 represent analyzed to learn and to identify normal and potentially fraudulent patterns of use Pattern recognition is a process whereby network event records are

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cnhance normalized event records 506c to create enhanced event records 748 informant 744 for data retrieval from external systems 746. This data is used to enhancer 740 employs a different configuration data component 742. engine 132 where they are received by a pattern recognition enhancer 740. similar to the thresholding and profiling enhancers 510 and 624, respectively, except that Pattern recognition enhancer 740 operates in much the same manner as the In step 420, normalized event records 506c are sent to pattern recognition thresholding and profiling processes, enhancer 740 uses an

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pattern analysis processor 754. history database 752 contains volumes of call data that can be analyzed by a component 750 enters each record 748 into the call history database 752. Call component 750, which maintains a call history database 752. Update and store In step 432, enhanced event records 748 are sent to an update and store

minimize processing of non-fraudulent information. can be non-fraudulent. Non-fraudulent patterns recognition is important to Interesting patterns include patterns which can be fraudulent and patterns which call history database 752 to determine whether any interesting patterns emerge. In step 434, pattern analysis processor 754 analyzes call histories from

them as fraudulent patterns. Processor 754 then detects emerging patterns of such deviations and identifies normal patterns and then looks for deviations that can be identified as fraudulent. call history 752, an AI-based pattern analysis processor 754 first determines determines whether it is a fraudulent or non-fraudulent pattern. To accomplish itself in identifying fraudulent patterns. By analyzing volumes of events from this, pattern analysis processor 754 uses artificial intelligence technology to train If an interesting pattern is detected, pattern analysis processor 754

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identified from the volumes of data stored in the call history database 752. an AI system for pattern analysis 754, both normal and fraudulent patterns can be parameters. Such systems are widely used for pattern recognition. By utilizing statistical-based algorithms that use iterative numerical processing to estimate include tree-based algorithms that obtain discrete outputs, neural networks, and There are various Al systems available for such a purpose. Examples

754 can detect a fraudulent pattern emerging with calling card calls made on reflect the most recent patterns of fraud. For example, pattern analysis processor recognizing fraudulent patterns, certain thresholding rules can be updated to modify threshold detection rules 522 via thresholding interface 756. In step 436, pattern analysis processor 754 uses the results of step 434 to

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a thresholding rule to generate an alarm 526 whenever such a call is made weekends to a certain country from certain states in the U.S. It can then update

patterns to build profiles that are identified as fraudulent or normal. processor 634. Using AI technology, profiling processor 634 processes these analysis processor 754 feeds known fraudulent and normal patterns to profiling modify profiles in profile database 130 via profiling interface 758. Pattern detection to keep pace with the most current schemes of fraud. through use of AI-based pattern recognition, the invention allows for fraud In step 438, pattern analysis processor 754 uses the results of step 434 to

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as some combination of parallel and non-parallel processing processing time. The processes can, however, be performed one after another or described as being performed substantially in parallel primarily to reduce the The processes of threshold detection, profiling and pattern recognition are

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B. Analysis Layer

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cases are presented to an expert system and to a human analyst. there are likely to be fewer false positives at the top of the priority list. Prioritized that can make use of any field of the case. Prioritization rules order cases so that or recalculated. Case priority is calculated from configurable prioritization rules case creation or the addition of a new alarm to a case, a case priority is calculated analysis layer 133 to consolidate and correlate the alarms into fraud cases. Upon alarm analysis process in which alarms generated in step 420 are analyzed by Referring to FIG. 8, a a process flowchart is provided for a preferred

alarms to build "cases" of fraud, thus reducing the total number of data that must related to the same fraudulent activity. Analysis layer 133 consolidates correlated examining various features of each alarm and correlating those that are possibly implementing the process of FIG.8. Analysis layer 133 consolidates alarms by Referring to FIG. 9, details of analysis layer 133 are provided for

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specific implementation portion. Preferably analysis layer 133 includes a core infrastructure portion and a usertypes of services, but which are possibly related to the same events or callers. be further examined. A case of fraud consists of alarms that can span several

alarm must belong to at least one case. If an alarm is created that matches an case is created for the alarm. existing non-closed case, the alarm will be added to the case. Otherwise, a new consolidated into one or more cases depending on the analysis rules used. Each types. Cases include alarms that have some aspect in common. Alarms can be Alarms are consolidated into cases according to analysis rules, or case

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preferably accompanied by probability of fraud. such as cellular, calling card, etc. Alarms 638 from profiling engine 128 are and 638 represent instances of possible fraud and designate fraud service type from profiling engine 128 are received by an alarm enhancer 902. Alarms 526 In step 810, alarms 526 from thresholding engine 126 and alarms 638

card number was deactivated two months ago". system to determine that "this ANI has a past due account of \$1000". Similarly, systems 908. For example, informant 906 can access an accounts receivable enhancer 902 then adds this information to alarms 526 and 638 and produces with various external systems 908 to retrieve the requested information. Alarm informant 906 can access an order entry system to determine that "this calling retrieved from billing, accounts receivable, order entry, or various other external added, based on the type of alarm received. Additional information can be additional information which can be needed and how that information should be the detection layer enhancers 510, 624 and 740. Enhancer 902 augments alarms enhanced alarms 910 526 and 638 to produce enhanced alarms 910. Configuration data 904 specifies In step 812, these alarms are enhanced. Alarm enhancer 902 is similar to Informant 906 communicates

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common aspect is "alerts having the same calling card number" correlation is based on common aspects of alarms. An example of such a correlating and consolidating various alarms into related fraud cases. In step 814, enhanced alarms 910 are sent to a fraud case builder 912 for

and which are generated for the same account" state "only build cases from alarms having greater than 50% probability of fraud was assigned by profiling processor 634 as a parameter. For example, a rule can and kept in a rules database. Rules 914 can use the probability of fraud which Correlation is governed by analysis rules 914, which can be programmed

fraud case builder 912 creates a new case for the alert. with existing cases, using analysis rules 914. If no existing case is appropriate, Fraud case builder 912 looks for features which the alarm can have in common determines whether there is an existing case or cases in which to place the alarm. In operation, fraud case builder 912 receives an enhanced alarm 910 and

can employ a case-locking mechanism to accomplish this goal. duplicate cases are not created if both data are identical. Fraud case builder 912 that the case reflects both data if the data are different, and attempts to ensure that with either identical data or different data, case builder 912 attempts to ensure updating a case, can occur. If two analysts are attempting to update the same case parallel processing environment, multiple instances of the same process, such as might occur due to the distributed platform of the invention. For example, in this case builder 912 also attempts to prevent corruption of cases, which otherwise Fraud case builder 912 attempts to prevent duplication of cases. Fraud

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number, and in a second case of consolidated alarms based on a common ANI can then be placed in a first case of consolidated alarms based on a common card for a calling card call can designate both the card number and the ANI. The alert fraud case, overall reduction of data can still be achieved. For example, an alarm that an analyst must examine. Thus, although an alarm can go into more than one A primary objective of the analysis layer is to reduce the amount of data

than one case. alarms that are consolidated exceeds the number of alerts that are placed in more However, overall reduction of alerts will generally be achieved as the number of

system layer 139 for further analysis and action. In step 816, fraud case builder 912 outputs fraud cases 916 to expert

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C. Expert System Layer

for implementing the process of FIG. 10. of fraud is significant. In Fig. 11, details of expert system layer 139 are provided to cases where a very high probability of fraud exists or where the potential cost automatically, the action rules which trigger automatic actions are applied only performing automated actions for some cases. Since some actions are performed by prioritizing them, adding additional information relevant to each case and cases and for automatically acting upon certain cases. The process analyzes cases Referring to FIG. 10, a process flowchart is provided for analyzing fraud

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priority to them and determines whether any actions should be automatically executed. received by a prioritizer 1102. Prioritizer 1102 enhances fraud cases 916, assigns In step 1010, fraud cases 916 are sent from analysis layer 133 and

systems 1108. Informant 1106 sends a query to an appropriate external system a fraud case. Informant 1106, serves as a communication interface to external 1106 receives the requested data and supplies it to prioritizer 1102. Prioritizer 1108 using a communications protocol of the external system 1108. Informant be needed for fraud cases 916, where to find the data and how to add the data to 1108. Configuration data 1104 specifies any additional information which can 1102 uses configuration data 1104, an informant 1106, and external systems In step 1012, fraud cases 916 are enhanced. To enhance cases, prioritizer

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1102 then adds the information to a fraud case, creating an enhanced fraud case 1114

configuration data 1104. Prioritization rules are based on experienced analysts' potential cost of a fraud case, which is influential in determining priority. customer's past revenue been." Such parameters are useful for determining the employ parameters retrieved from external systems such as, "how much has into configuration data 404 as logical algorithms. Prioritization rules can also rules for determining and prioritizing fraud cases. These rules are programmed cases, prioritizer 1102 employs prioritization rules which are kept as part of In step 1014, enhanced fraud cases are prioritized. To assign priority to

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typically initiated by human analysts. are initiated by an expert system, following pre-defined rules. Other actions are user initiated, mail initiated or manual. Automatic and semi-automatic actions privilege modifications. Actions are categorized as automatic, semi-automatic, system. Examples of actions include card deactivation or activation or use-range data 1104. An action is a response to suspected fraud and involves an external a case, prioritizer 1102 uses action rules which are kept as part of configuration are specified based on action rules. In determining whether to initiate action on In step 1016, prioritized fraud cases are analyzed and appropriate actions

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cases specified conditions. For example, under a pre-specified condition of excessive back-logs, the expert system can automatically deactivate high-priority fraud Semi-automatic actions are initiated by an expert system under pre-

include activations and deactivations of accounts such as telephone accounts, credit card account and debit card accounts User initiated actions are performed upon user requests. Actions can

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from external groups, such as a customer service group, through electronic mail Electronic mail initiated action are performed upon a request received

telephone accounts, credit card account and debit card accounts scripts. Actions can include activations and deactivations of accounts such as

independent of the system. The external user can request that the system record that the action was performed. Manual actions are initiated by users external to the system and executed

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account") and type of service (i.e., cellular. calling card, dial 1). Action rules can parameters as priority (i.e., "for any case over priority level N, deactivate Action rules can be programmed as logical algorithms and can consider such number, placing a switch block on an ANI or sending out a notice to a customer. actions to take on a fraud case. include data retrieved from external systems. Action rules are based on experienced analysts' rules for specifying Actions can include deactivating a calling card

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contacting card holder whose card is suspected of fraudulent activity might indicate to contact a customer fraud investigation unit rather than suspected fraud on certain customer accounts. For example, special instructions manual actions can reference special handling instructions for acting upon Action rules form part of the implementation layer. Action rules for

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service (i.e., cellular. calling card, dial 1), or enhanced data retrieved from priority (i.e., "for any case over priority level N, deactivate account"), type of algorithms to be applied to enhanced cases. external systems 1108. Action rules are programmed into configuration data 404 as logical These actions can be based on

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personnel, customer service centers, print centers for mailing dunning letters and deactivations, electronic mail system for e-mail notices to customers or internal systems for account deactivations, network control systems for calling card can include switch interface systems for switch-based ANI blocks, order entry interfacing with various external action systems 1112. External action systems various other systems. Enforcer 1110 preferably resides on servers 310a ... 310n In step 1018, an enforcer 1110 executes actions specified in a step 1016

for mailing dunning letters, or various other systems. notices to customers or internal personnel, customer service centers, print centers control systems for calling card deactivations, electronic mail system for e-mail switch-based ANI blocks, order entry systems for account deactivations, network the action. External action systems 1112 can include switch interface systems for 1102 and interfaces with an appropriate external action system 1112 to execute In operation, enforcer 1110 receives a request for action from prioritizer

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based language appropriate for expert systems, such as CLIPS. However, it is preferable to program a customized expert system using a logicdetermine what actions to perform. An off-the-shelf expert system can be used. data 1104, perform as an expert system, applying expert rules to data records to along with the prioritization rules and action rules that are kept as configuration exists or where the potential cost of the fraud is significant. Prioritizer 1102, trigger them are preferably applied only to cases where a high probability of fraud Since these actions are performed automatically, the action rules that

presentation layer 143 for further examination and potential action from a human to a case by a human analyst working at workstation 152a-152n data not useful to the automated expert system layer 139, such as text notes added analyst. Also sent as part of an enhanced case 414 to presentation layer 143 are Cases in which an automated action is not warranted are sent to

D. Presentation Layer

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expert system layer 139 and those which do not, are sent to presentation layer 143 for examination and potential action by a human analyst at workstations 152a-Fraud cases 1114, including those which warrant automatic action in the

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interfacing the detection layer 123 and analysis layer 123 with human analysts Referring to FIG. 12, details of a presentation layer 143 are provided for

retrieve and add additional data and to perform actions similar to those performed already taken. probability of fraud, information retrieved from external systems, and any actions by the expert system layer 139 Preferably, fraud cases 1114 include data generated in upper layers such as working at workstations 152a ... 152n which are connected to LAN 150. Presentation layer 143 preferably allows human analysts to

presentation to an analyst. to augment enhanced fraud cases 1114 with additional information relevant for case enhancer 1202. Similar to data enhancers of the upper layers, case enhancer 1202 uses configuration data 1204, an informant 1206, and external systems 1208 Enhanced fraud cases 1114 from expert system layer 139 are received by

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receivable system 1216. presentation interface 1210 requesting this data. Presentation interface 1210 then action. The analyst, via a workstation 152a ... 152n, sends a command to a case and decide that a customer's payment history is needed prior to taking any informant 1214 retrieves data from external systems 1216 based on commands instructs from analysts at work stations 152a ... 152n. For example, an analyst can view as logical algorithms into a database and are configurable. Presentation interface cases are presented according to presentation rules 1212, which are programmed 1210 employs an informant 1214 and external systems 1216 to retrieve additional 152a ... 152n, providing data for graphical presentation to the analyst. Fraud A presentation interface 1210 serves as an interface to workstations informant 1214 to retrieve this data from an external accounts However, this is not automatic, as in the upper layers. Rather

workstation 152a ... 152n, sends a command to presentation interface 1210 analyst can decide that a switch block on an ANI is needed. The analyst, via a This is not automatic, as it was in the expert system layer 139. Rather, enforcer 1218 performs actions based on commands from analysts. Presentation interface 1210 uses enforcer 1218 for performing actions. For example, an

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layer 239. external action systems 1220 can be similar to those employed by expert system action, switch interface system 1220 to implement the ANI switch block. Other enforcer 1218 to execute the command. Enforcer 1218 interfaces with an external requesting a switch-based ANI block. Presentation interface 1210 then instructs

IV. Conclusions

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equivalents. should be defined only in accordance with the following claims and their should not be limited by any of the above-described exemplary embodiments, but only, and not limitation. Thus, the breadth and scope of the present invention above, it should be understood that they have been presented by way of example While various embodiments of the present invention have been described

What Is Claimed Is:

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detecting engines.	parallel processing the dispatched portions in the plurality of fraud	detecting engine; and,	dispatching normalized network event records to at least one fraud	formats into standardized formats;	normalizing the network event records from any of a variety of	The method of claim 1, wherein step (1) comprises the steps of:	automatically responding to certain of the fraud cases.	aspects of the fraud alarms; and	correlating the fraud alarms into fraud cases based on common	of the fraud detection tests;	generating fraud alarms upon detection of suspected fraud by any	event records;	performing a plurality of types of fraud detection tests on network	comprising the steps of:	method for detecting fraud in a telecommunications system,

1	ψ	The m	The method of claim 2, wherein step (c) comprises the step of enhancing
2			the normalized dispatched network event records prior to testing
ω			for fraud.
1	4,	The n	The method of claim 1, wherein step (1) comprises the steps of:
2		(a)	selecting a threshold rule from a plurality of threshold rules stored
ω			in a threshold rule database; and
4		(ъ)	determining whether a network event record violates the selected
S			threshold rule.
1	5.	The n	The method of claim 4, further comprising the step of:
2		<u>©</u>	updating the threshold rule database during run-time.
1	6.	The n	The method of claim 5, wherein step (c) comprises the steps of:
2		Θ	analyzing the network event records to identify new methods of
ω			fraud;
4		(ii)	generating new threshold rules for detecting the new methods of
S			fraud; and
6		(iii)	updating the threshold rule database with the new threshold rules.

	9.							œ						7.
(a)	The n			where	9		(a)	The n	(iii)		(ii)		Θ	The r
updating the profile database during runtime.	The method of claim 8, further comprising the step of:	network event record violates the profile.	probability of fraud based upon the extent of the departure if a	wherein step (2) comprises the step of generating an alarm and a	determining whether a network event record violates the profile;	database; and	selecting a profile from a plurality of profiles stored in a profile	The method of claim 1, wherein step (1) comprises the steps of:	updating the threshold rule database with the new threshold rules.	fraud using artificial intelligence; and	generating new threshold rules for detecting the new methods of	fraud using artificial intelligence;	analyzing the network event records to identify new methods of	The method of claim 5, wherein step (c) comprises the steps of:

4	w	2	-	И	1	u	, D	<u></u>	В	-		6	Ŋ	4	ω	2	-
			14.		13.			12.		11.							10.
	Œ	Ξ	The n		The m		(a)	The n		The n		(iii)		(ii)		Ξ	The n
correlating.	enhancing the fraud alarms with the retrieved data prior to	retrieving data from an external system; and	The method of claim 12, wherein step (a) comprises the steps of:	the fraud alarms with data prior to correlating.	The method of claim 12, wherein step (a) comprises the step of enhancing	associated with each of the fraud cases.	prioritizing the fraud cases to indicate a probability of fraud	The method of claim 1, wherein step (3) comprises the step of:	artificial intelligence.	The method of claim 10, wherein steps (ii) and (iii) are performed via	1	updating the profile database with the new profiles.	fraud; and	generating new profiles representative of the new methods of	fraud;	analyzing the network event records to identify new methods of	The method of claim 9, wherein step (d) comprises the steps of:

to act upon certain of the fraud cases.	00
an expert system layer to receive fraud cases from the analysis layer and	7
to consolidate the alarms into fraud cases; and	0
an analysis layer to receive alarms generated by the detection layer and	O1
fraud;	+
fraud and to generate alarms indicating incidences of suspected	w .
management layer, to test the network event records for possible	2
a detection layer to receive network event records from the data	-
records, the multi-layer fraud detection system comprising:	J
redundancy and consolidating multiple records into network event	v
service control layer and for reducing data by eliminating	w
service records from various components and processes of the	7
the network layer, and a data management layer for receiving the	50
containing data representing instances of telecommunications in	5
for managing the network layer and for generating service records	•
at least one telecommunications network, a service control layer	ű
the telecommunication system comprising a network layer having	Į.
A multi-layer fraud detection system for a telecommunications system,	16.
(6) manually responding to certain of the fraud cases.	•
(5) presenting the fraud cases to live operators; and	, C
The method of claim 1, further comprising the steps of:	15.

engine.	3
one fraud detection engine comprises a rules-based thresholding	И
The multi-layer fraud detection system of claim 18, wherein said at least	1 20.
records to said at least one fraud detection engine.	7
a dispatcher to dispatch portions of said normalized network event	٥
said at least one fraud detection engine; and	
a plurality of formats into standardized formats for processing by	4
a network event normalizer to convert network event records from any of	ω
detection layer further comprises:	2
P. The multi-layer fraud detection system of claim 18, wherein said	1 19.
specific implementation.	4
engine having a core infrastructure and a configurable, domain-	W
detection layer further comprises at least one fraud detection	И
The multi-layer fraud detection system of claim 17, wherein said	1 18.
domain-specific implementation.	ω
detection layer comprises a core infrastructure and a configurable,	2
The multi-layer fraud detection system of claim 16, wherein said	1 17.

2 -	21.	The multi-layer fraud detection system of claim 18, wherein said at least one fraud detection engine comprises:
4		and
5		a configurable informant to interface said enhancer to an external system
o,		and to retrieve additional data from the external system.
1	22.	The multi-layer fraud detection system of claim 21, further comprising;
2		means for interfacing said informant with the external system in a format
ω		native to the external system; and
4		a rules database comprising instructions for processing the enhanced
S		event records to detect fraud.
1	23.	The multi-layer fraud detection system of claim 22, wherein:
2		said at least one fraud detection engine includes a rules-based
ω		thresholding engine; and
4		said rules database comprises threshold rules for use by said rules-based
Oi.		thresholding engine.
-	24.	The multi-laver fraud detection system of claim 22 wherein.
N		said at least one fraud detection engine includes a profiling engine; and
ω		said rules database comprises profiles for use by said profiling engine.

generated by said detection layer.		w
a configurable fraud case builder to consolidate fraud alarms that are		7
and		U1
system and to retrieve additional data from the external system;		VI
a configurable informant to interface said alarm enhancer to an external		Ī
a configurable alarm enhancer to augment fraud alarms with data;		
layer further comprises:		
The multi-layer fraud detection system of claim 26, wherein said analysis	27.	
specific implementation.		-
layer comprises a core infrastructure and a configurable, domain-		
The multi-layer fraud detection system of claim 16, wherein said analysis	26.	
least one fraud detection engine.		•
learns new patterns of fraud and that generates updates for said at		•
detection layer further comprises a pattern recognition engine that		,,,
The multi-layer fraud detection system of claim 18, wherein said	25.	

. 1	28.	The multi-layer fraud detection system of claim 27, wherein said user-
ы		specific implementation layer of said analysis layer further
ω		comprises:
4		means for interfacing said informant with the external system in a format
G		native to the external system; and
6		an analysis rules database comprising instructions for said fraud case
7		builder for filtering and correlating fraud alarms into fraud cases
8		according to at least one common attribute.
•	}	
2		one common attribute is one of the following attributes:
ω		ANI;
4		originating switch;
G		credit card number;
0		DNIS;
7		destination country;
∞		originating geographic area;
9		originating area code; and
0		calling equipment type.

prioritizer.	12
action system based upon commands that are generated by the	11
action system and that directs execution of actions by the external	10
a configurable enforcer that interfaces said prioritizer to an external	٥
external system; and	∞
external system and that retrieves the additional data from the	7
a configurable informant that interfaces said alarm enhancer to an	6
systems for certain of the prioritized, enhanced fraud cases;	5
the enhanced fraud cases and directs actions on external action	4
a configurable prioritizer that generates enhanced fraud cases, prioritizes	ω
system layer domain-specific implementation comprises:	ν
31. The multi-layer fraud detection system of claim 30, wherein said expert	1 3:
domain-specific implementation.	ω
system layer comprises a core infrastructure and a configurable,	2
30. The multi-layer fraud detection system of claim 16, wherein said expert	30

prioritized fraud cases to one or more workstations and that sends		6
a configurable presentation interface that distributes the enhanced,		O
additional data;		4
a configurable case enhancer that enhances prioritized fraud cases with		w
specific implementation of said presentation layer comprises:		2
The multi-layer fraud detection system of claim 33, wherein said domain-	34.	_
implementation.		0
infrastructure and a configurable, domain-specific		C
operators, wherein said presentation layer includes a core		4
system layer and that presents the prioritized fraud cases to live		ω
a presentation layer that receives prioritized fraud cases from said expert		2
The multi-layer fraud detection system of claim 16, further comprising:	33.	1
prioritizing rules for use by the prioritizer.		7
native to the external system; and		6
means for interfacing said informant with the external system in a format		Ŋ
comprises:		4
a configuration database, and wherein said configuration database		ω
specific implementation layer of said expert system layer includes		2
The multi-layer fraud detection system of claim 31, wherein said user-	32.	-

system.	ω
second external systems are each a part of the same external	2
35. The multi-layer fraud detection system of claim 34, wherein the first and	1
upon commands generated at the workstations.	19
directs execution of actions by the external action system based	18
presentation interface, to the external action system and that	17
a configurable enforcer that interfaces the workstations, via said	16
workstations; and	15
second external system, based upon commands generated at the	14
to a second external system and that retrieves data from the	13
a configurable second informant that interfaces said presentation interface	12
system;	11
external system and that retrieves data from the first external	10
a configurable first informant that interfaces said case enhancer to a first	9
action system;	8
action commands generated at the workstations to an external	7

(5) performing steps (1) and (3) in parallel.		2
The method of claim 37, further comprising the step of:	38.	
the selected profile.		0
(4) generating an alarm when the network event record deviates from		9
selected profile; and		∞
(3) determining whether the network event record deviates from a		7
selected threshold rule;		6
(2) generating an alarm when the network event record violates the		Ŋ
threshold rule;		4
(1) determining whether a network event record violates a selected		B
the steps of:		2
A method of detecting fraud in a telecommunications system, comprising	37.	;
prioritized fraud cases at the workstations.		7
configurable presentation rules to direct presentation of enhanced,		6
interfacing format that is native to the first external system; and		S
means for interfacing said informant with the first external system in an		4
comprises:		ω
specific implementation layer of said presentation layer further		2
The multi-layer fraud detection system of claim 34, wherein said user-	30.	۲

40.	The n The n (6)	The method of claim 37, further comprising the steps of: (5) analyzing a history of network event records to identify normal patterns of use in a telecommunications system; and (6) analyzing a history of network event records to identify fraudulent patterns of use in a telecommunications system. The method of claim 37, further comprising the steps of: (5) analyzing a history of network event records to identify normal patterns of use in a telecommunications system, using artificial intelligence; and (6) analyzing a history of network event records to identify fraudulent patterns of use in a telecommunications system, using artificial intelligence.
40.	The n (5)	nethod of claim 37, further comprising the steps of: analyzing a history of network event records to identify normal
	6	intelligence; and analyzing a history of network event records to identify fraudulent patterns of use in a telecommunications system, using artificial
41.	The n	intelligence. The method of claim 40, further comprising the step of:
	9	generating at least one of the following types of updates when a fraudulent pattern of use is identified:
		updates for a threshold rules database; and updates for a profile database.

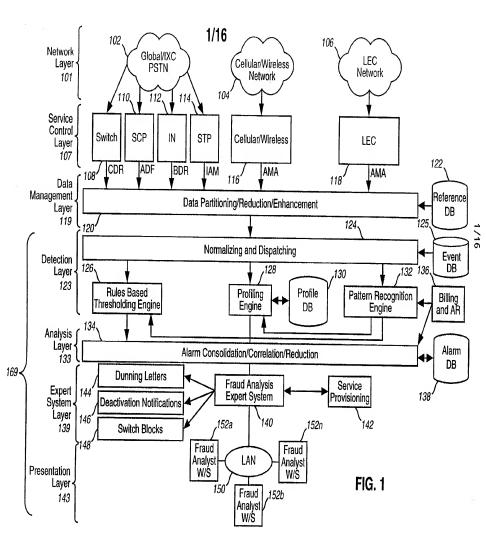
profiles for comparison to credit card event records.		5	
thresholding rules for testing credit card event records; and		4	
said configurable, domain-specific implementation comprises:		ω	
implemented as part of a credit card fraud detection system an		2	
The system according to claim 42, wherein said core infrastructure i	44.		
profiles for comparison to telecommunications network event records.		7	
and		0	
thresholding rules for testing telecommunications network event records		S	
comprises:		4	
system and said configurable, domain-specific implementatio		3	
implemented as part of a telecommunications fraud detectio		2	
The system according to claim 42, wherein said core infrastructure	43.	1	
rules.		S	
a configurable, domain-specific implementation including configurabl		4	
application; and		ω	
a scalable core infrastructure that can be implemented in more than on		2	
A system for processing event records, comprising:	42.	1	

that acts upon certain cases.		9
an expert system layer that receives cases from said analysis layer and		∞
traits of the alarms; and		7
consolidates the received alarms into cases based upon common		6
an analysis layer that receives alarms from said detection layer and that		Ŋ
alarms when an event record meets a condition;		4
event records to one or more detection engines and generates		ω
a detection layer that detects and normalizes event records, dispatches		2
The system according to claim 42, further comprising:	47.	1
profiles for comparison to consumer purchasing event records.		9
thresholding rules for testing consumer purchasing event records; and		S
comprises:		4
system and said configurable, domain-specific implementation		ω
implemented as part of a consumer purchasing pattern analysis		ъ
The system according to claim 42, wherein said core infrastructure is	46.	1
profiles for comparison to data mining event records.		5
thresholding rules for testing data mining event records; and		4
configurable, domain-specific implementation comprises:		ω
implemented as part of a data mining system and		2
The system according to claim 42, wherein said core infrastructure is	45.	

means for enabling the computer to respond to certain of the cases	0
on common aspects of the alarms; and	9
means for enabling the computer to correlate the alarms into cases based	8
conditions;	7
means for enabling the computer to generate alarms upon certain tested	6
means for enabling the computer to test event records;	5
records, wherein said computer program logic comprises:	4
program logic for enabling a computer system to process event	3
having computer program logic stored therein, said computer	2
A computer program product comprising a computer useable medium	1 50.
to take actions based upon the commands from human analysts.	S
human analysts and sends instructions to external action systems	4
the received cases to human analysts, receives commands from	ω
a presentation layer that receives cases from the detection layer, presents	2
The system according to claim 42, further comprising:	1 49.
occurrences of an event feature.	ω
means for generating feature vectors for representing multiple	2
The system according to claim 47, said detection layer further comprising:	1 48.

•	51.	The co	The computer program product according to claim 50, further comprising:
2		mean	means for enabling the computer to present the cases to live operators;
3			and
4		means	means for enabling the computer to permit the live operators to manually
5			initiate responses to certain of the cases.
-	52.	The co	The computer program product according to claim 50, further comprising:
		user o	user configurable means for enabling the computer to process user-
w			specific types of event records; and
+		core i	core infrastructure means for enabling the computer to process event
OI.			records for a variety of types of event records.
	53.	A met	A method for processing event records, comprising the steps of:
Į.		Ξ	testing event records;
~		(2)	generating alarms upon certain tested conditions;
•		(3)	correlating the alarms into cases based on common aspects of the
01			alarms; and
•		4	generating responses to certain of the cases.

			54.
	6)	(5)	The n
certain of the cases.	permitting the live operators to manually initiate responses to	presenting the cases to live operators; and	The method according to claim 53, further comprising the steps of:



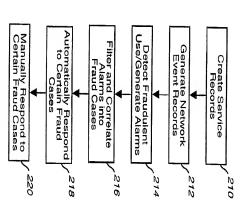
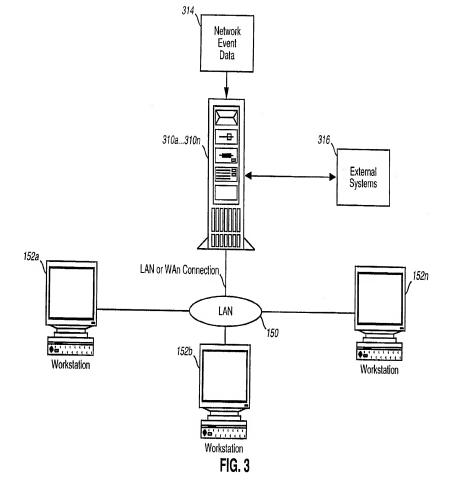
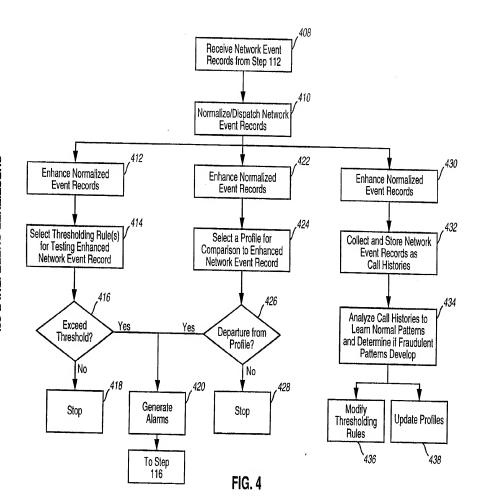


FIG. 2





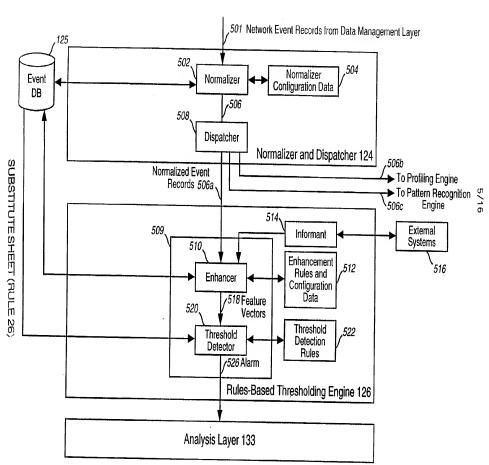


FIG. 5A

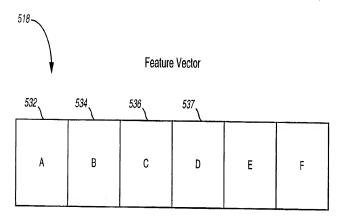


FIG. 5B

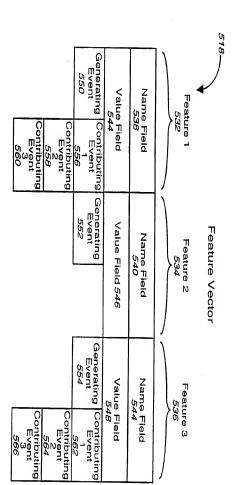


FIG. 5C

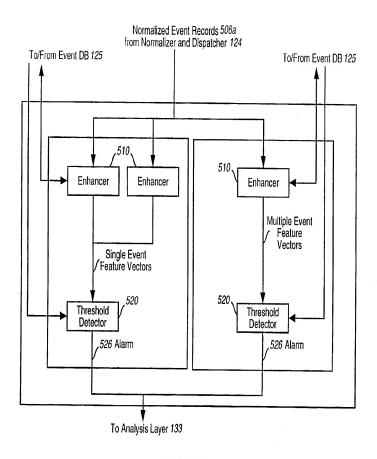


FIG. 5D

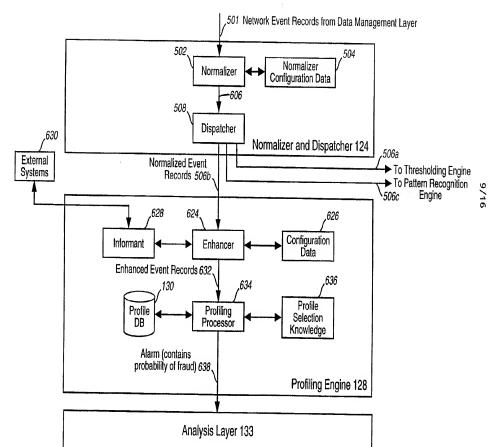
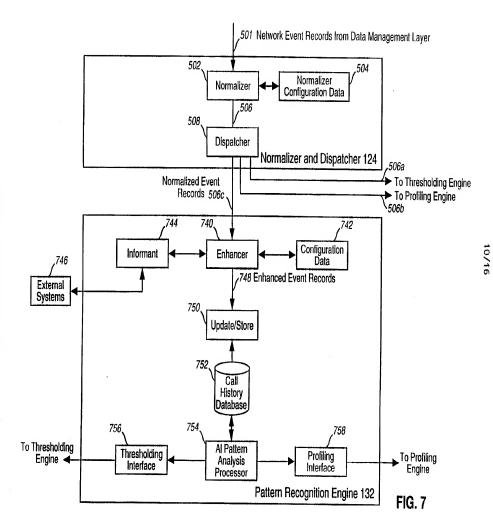
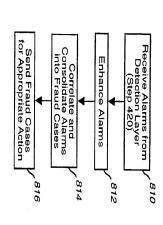


FIG. 6





Alarm Consolidation, Correlation and Reduction

FIG. 8

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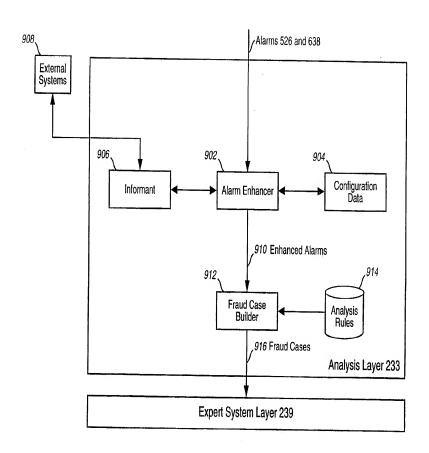
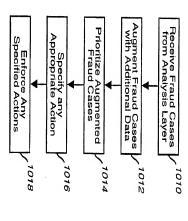


FIG. 9



Fraud Case Processing in an Expert System Layer

FIG. 10

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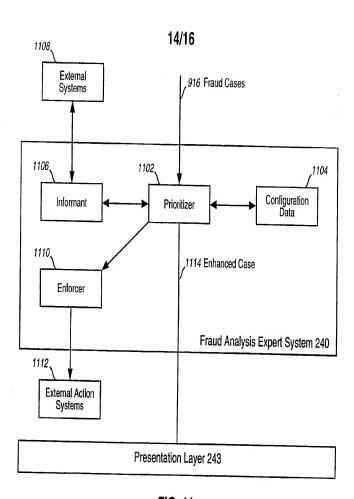


FIG. 11

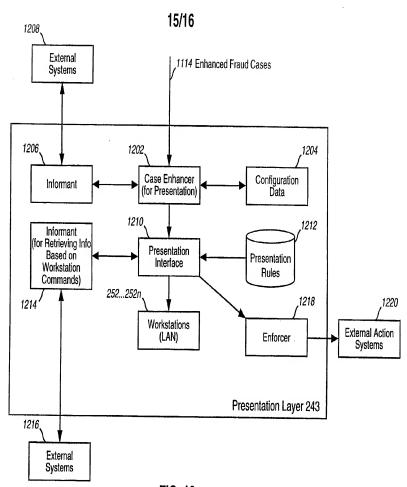
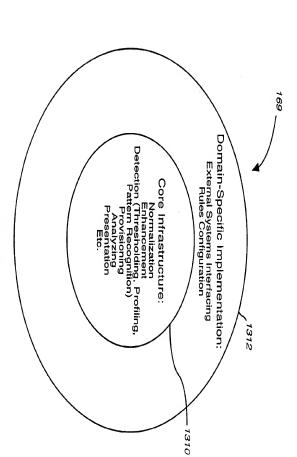


FIG. 12



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FIG. 13



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INTERNATIONAL APPLICATION PUBLISHED UNDER THE PATENT COOPERATION TREATY (PCT)

G06F 15/00, G06G 7/00	(51) International Patent Classification 6:	
A 3		
(43) International Publication Date:	(11) International Publication Number:	
18 March 1999 (18.03.99)	WO 99/13427	

(22) International Filing Date: (21) International Application Number: 11 September 1998 (11.09.98) PCT/US98/19039

(30) Priority Data:

08/928,851

12 September 1997 (12.09.97)

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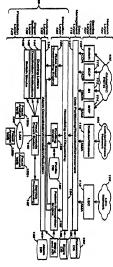
(81) Designated States: AL, AM, AT, AU, AZ, BA, BB, BG, BR, BY, CA, CH, CN, CU, CZ, DE, DK, EE, ES, FI, GB, GH, GH, GM, HR, HU, ID, II, IS, IP, KE, KG, KP, KR, KZ, LC, LK, LK, LS, LT, LU, LY, MD, MG, MK, MN, MW, MX, NO, NZ, PL, FT, RO, RU, SD, SE, SG, SI, SK, SL, TJ, TM, TR, TT, UA, UG, US, UZ, VN, YU, ZW, European patent (AT, BE, CH, CY, DE, DK, ES, FI, FR, GB, GR, IE, IT, LU, MC, NL, PT, SE).

Published

With international search report.

(88) Date of publication of the international search report:
10 June 1999 (10.06.99)

(54) Title: SYSTEM AND METHOD FOR DETECTING AND MANAGING FRAUD



(57) Abstract

am analysis layer (133), an expert systems layer (139), and a presentation layer (143). The layered system includes a core infrastructure (1310) and a configurable, domain-specific implementation (1312). The detection layer (123) employs one or more detection engines, such as, for example, a rules-based thresholding engine (126) and a profiling engine (128). The detection layer can include an Al-based pattern recognition engine (130) for analyzing data records, for detecting new and interesting patterns and for updating the detection engines to ensure that the detection engines can detect the new patterns. A system, method and computer program product for processing event records. The present invention includes a detection layer (123),

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Name and mailing address of the ISA/US Commissioner of Patents and Trademarks Box PECT DC: 20231 Washington, D.C. 20231	20 DECEMBER 1998	Date of the actual completion of the international search	document published prior to the international filing date but later than the priority date claimed	document referring to an oral disclosure, use, exhibition or other means	eited to establish the publication dats of another citation or other appeals reason (as specified)		document defining the general state of the art which is not considered to be of particular relevance		Further documents are listed in the continuation of Box C.	US 5,375,244 A (MCNAIR) 20 December 1994, col. 6, lin 60-67; col 7, lin. 1-2; col. 1-2, all.	US 5,495,521 A (RANGACHAR) 27 February 1996, col. 5, lin. 37-67; col. 6, lin. 35-50; col. 6, lin. 10-34; col. 4, lin. 30-35; col. 11, lin.1-12; col. 4, lin. 28-31; col.5, lin. 28-36; col. 11, lin. 26-30; col.10, lin. 33-41; col. 10, 18-32; col. 4, 16-17; col. 1, 33-41; col. 3, lin. 20-32; figs. 3-13; col.11, lin. 27-36; col. 4, 30-35; col. 12, lin. 4-9; col. 6, lin. 64-67; col 13, all; col. 10, lin. 65-67; col. 5, lin. 45-55; col. 11, lin. 18-25; col. 9, lin 40-50;	Citation of document, with indication, where appropriate, of the relevant passages	DOCUMENTS CONSIDERED TO BE RELEVANT	Electronic data base consulted during the international search (name of data base and, where practicable, search terms used) APS	Documentation searched other than minimum documentation to the extent that such documents are included in the fields searched	706/10	B. FIELDS SEARCHED Minimum documentation searched (classification system followed by classification symbols)	US CL: 766/10 According to International Patent Classification (IPC) or to both national classification and IPC	CLASSIFICATION OF SUBJECT MATTER	INTERNATIONAL SEARCH REPORT
Authorized officer formed A. Mtatthell	1 8 MAR 1999	Date of mailing of the international search report	*&* document member of the same patent family	combined with one or more other such documents, such combination being obvious to a person skilled in the art	"Y" document of particular relevance; the	X. document of particular relevance; the classifier invention cannot be considered to involve an inventive step when the document is taken alone		"I" later document published after the international filing date or priority	See patent family annex.	nber 1994, col. 6, lin 60-67;	February 1996, col. 5, lin. 0-34; col. 4, lin. 30-35; col. n. 28-36; col. 11, lin. 26-30; 4, 16-17; col. 1, 33-41; col. 17-36; col. 4, 30-35; col. 12, col. 10, lin. 65-67; col. 5, lin 40-50;	ropriate, of the relevant passages		ne of data base and, where practicable,	extent that such documents are included	3,	by classification symbols)	ational classification and IPC		International application No. PCT/US98/19039
Matthews		arch report	t family	h documents, such combination the art	step when the document is	red to involve an inventive step	e invention	ernational filing date or priority		9, 10	9-11, 37-54	Relevant to claim No		search terms used)	in the fields searched					cetion No.

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INTERNATIONAL SEARCH REPORT

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37, 39-40, 41, 47, 50-54	11, 38, 42, 43-46, 48, 49	Relevant to claim No.		19

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